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# A correctly rounded implementation of the exponential function on the Intel Itanium architecture

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> Thème 2 — Génie logiciel et calcul symbolique Projet Arénaire

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Abstract: This article presents an efficient implementation of a correctly rounded exponential function in double precision on the Intel Itanium processor family. This work combines advanced processor features (like the double-extended precision fused multiply-and-add units of the Itanium processors) with recent research results giving the worst-case precision needed for correctly rounding the exponential function. We give and prove an algorithm which returns a correctly rounded result (in any of the four IEEE-754 rounding modes) within 172 machine cycles on the Intel Itanium 2 processor. This is about four times slower than the less accurate function present in the standard Intel mathematical library. The evaluation is performed in one phase only and is therefore fast even in the worst case, contrary to other implementations which use a multilevel strategy [18, 6]: We show that the worst-case required precision of 157 bits can always be stored in the sum of two double-extended floating-point numbers. Another algorithm is given with a 92 cycles execution time, but its proof has to be formally completed.

Key-words: Correct rounding, IEEE-754, exponential, Itanium

This text is also available as a research report of the Laboratoire de l'Informatique du Parallélisme http://www.ens-lyon.fr/LIP.

# Une implémentation de l'exponentielle avec arrondi correct sur architecture Intel Itanium

Résumé: Cet article présente une implémentation efficace de la fonction exponentielle en double précision avec arrondi correct sur la famille de processeurs Intel Itanium. Ce travail combine les caractéristiques avancées de ces processeurs (en particulier la présence d'unités de multiplication-accumulation en double précision étendue) avec les résultats de travaux récents sur les pires cas d'arrondi correct pour l'exponentielle. Nous décrivons et prouvons un algorithme qui calcule le résultat arrondi correctement (dans l'un quelconque des quatre modes d'arrondis spécifiés par la norme IEEE-754) en 172 cycles sur l'Itanium 2 d'Intel, soit environ quatre fois plus lentement que la fonction exponentielle standard, moins précise. L'évaluation est réalisée en une seule étape, et est donc rapide également au pire cas, au contraire d'autres implémentations qui utilisent une stratégie multi-niveaux : nous montrons que les résultats intérmédiaires (qui ont besoin d'une précision jusqu'à 157 bits) peuvent toujours être représentés comme la somme de deux nombres flottants en double précision étendue. Nous présentons également un algorithme amélioré qui réalise le calcul en 92 cycles, mais sa preuve reste à formaliser complètement.

Mots-clés: Arrondi correct, IEEE-754, exponentielle, Itanium

# A correctly rounded implementation of the exponential function on the Intel Itanium architecture

Christoph Quirin Lauter

# 1 Introduction

When the **IEEE 754 standard** was finally adopted in 1985 [5] it represented a breakthough towards the standardisation of floating point arithmetics. Before, the behaviour of a programm depended on the platform it was executed on [6] The standard defines two main floating point formats called single and double precision and defines the exact semantics of the four standard operations which are addition, substraction, multiplication and division. All this operations can be considered to produce correctly rounded results, i.e. if the operation were carried out in infinite precision and if this intermediate result were rounded using one of the four rounding modes defined by the standard the obtained result would be same as that one produced by the underlying finite precision hardware. In addition to the four general operations, the square root function and the remainder operation have been normalized as to be implemented with a correct rounding [5, 6].

Unfortunately, this standard has some major defaults. The first one is a historical one. When the standard has been set up, processors integrated floating point units aiming other goals than nowadays' processors which include new features. In fact, modern processors support much wider formats than the double precision format and some supplementary 'basic' ternary operations with only one rounding; e.g. the Intel Itanium Processor has a 82 bit wide floating point register format in addition to the 64 bit IEEE double precision format and it implements the so called fused-multiply-and-add instruction fma which calculates  $a \cdot b + c$  as if it were calculated in infinite intermediate precision and than rounded to the operational precision, i.e. 82 bit.[11] A programmer using the IEEE standard as a reference would actually expect in this case an intermediate rounding of the multiplicative term of the expression  $a \cdot b$  before the addition to the term c. Despite this, as we will see, the described behaviour of this instruction is very useful for some techniques allowing us to 'emulate' a very large floating point format by means of two working precision numbers.

The second problem encountered when one is speaking about the IEEE standard is that it does not specify the behaviour of the standard transcendental functions so as the exponential

<sup>&</sup>lt;sup>1</sup>The four IEEE rounding modes are: round to nearest (RTN), round towards plus infinity (RTPI), round towards minus infinity (RTMI) and round towards zero (RTZ), cf. [5].

function. As we will see, if there were a standard also for transcendental functions, or if they were included in the IEEE standard, some advantages could be observed.[5, 2] As Muller mentions in [2] some of the transcendental functions are even implemented very so bad in common runtime libraries that they produce completely wrong results on some arguments. Since the common application programmer using a library is not supposed to think about the numerical stability of the transcendental functions implemented there this could potentially lead to buggy behaviour of some applications. In addition, the lack of an exact definition of the results to be returned by standard libraries prohibits portability of applications over serveral platfoms and makes dressing up correctness proofs for these applications completely impossible. In the domains where guarantees on the correct working of a programm must be given, e.g. medical applications or avionics, this can be a major issue. In contrast, it should be mentionned that some mathematical properties are incompatible with correct rounding so it can also be a problem.[6]

But one question remains to be answered: why does the IEEE 754 standard remain silent on transcendental functions? As [2, 7, 6] point out in their respective works, the main issue in the calculation of elementary functions with a correct rounding is a problem which was already known before the invention of computers and which is therefore called the table maker's dilemma: we can guarantee the correct rounding of an approximation to a transcendental function only if we can detect in the finite precision intermediate result we use a digit pattern that guarantees that the rounding will always be the same regardless of the following digits of the infinite development of the transcendental function. For example, if we calculate a 64 bit approximation to some function on some argument that we want to round in round-to-nearest mode to a 53 bit double precision number and bits 54 to 64 are of the form 01111111111 we cannot guarantee that rounding a more precise, i.e. a fortiori infinite precise result would not lead to a different final result: what would be if we had made an approximation error so that the actual sequence would be 10000000000? The final result would have to be rounded upwards at the 53rd digit and not downwards as one may suspect at the first sight. To conclude<sup>2</sup>, the intermediate precision needed is much higher than the final result precision one wants to obtain. In addition, since is it can not be analytically calculated, the actual precision needed was not known at the time the standard was defined. This were in fact the main reasons for not including elementary functions in the IEEE 754 standard. Despite, some new results on research on this issue and the evaluation of processors since the creation of this standard seem to provide a sufficient base for a correct rounding implementation of elementary functions which can bear comparison with less accurate ones. This article aims also this target.

Before considering more closely our techniques to achieve this goal, let us brievely mention the different steps in the techniques recommanded for a correct implementation of the exponential function.

As one can read in [2, 18], Ziv uses a multilevel evaluation of the exponential function calculating more and more significative digits of an approximation until the rounding can be done without any error. This technique has two main defaults: as far as we know, the

<sup>&</sup>lt;sup>2</sup>For a more complete description of the problem the reader could refer to [2].

algorithm has been proven to be correct only in a general way, the implementation itself has not, and further, which is the major issue with it, there are no bounds on the timings of the algorithm as it uses a loop running until the rounding can be done. This can be a problem in applications where the timing is critical or where ressources are restricted.

In order to improve this multilevel technique, Lefèvre [7] has done research on the problem and provides us some bounds on the maximal intermediate precision needed for a final double precision result. These results are exploited by Defour [6] to lead to a two level evaluation algorithm which is the first implementation of a correctly rounded exponential with bounded timings. Unfortunately, the algorithm presents still some defaults which could prevent its application on a everyday-everywhere-basis. Its maximum timings are still more than 20 times higher than its average timings which are also not very attractive in comparison to less accurate industrial implementations which facilitate their use in applications with real-time behaviour. In this context, 'less accurate' means that these functions return an approximation within typical e.g. 0.502ulp for the exponential function but that they do not guarantee the correct rounding of the result. [11]

By means of using some supplementary hardware features which are not exploited in Defour's algorithm for a reason of portability, we can now present a one phase correctly rounding algorithm for the exponential function which is completely self-contained, relatively small in size and, having a latency of 172 cycles on Intel Itanium 2, presents quite good performance on nowadays' processors.

Before continuing presenting the algorithm and the techniques used to guarantee that it calculates a correctly rounded approximation to the exponential function, let us give a short overview of the next sections. We will first give a general description of the algorithm and will then proof an accuracy bound for the main domain of the input values. This proof is relativly complex but contains only a few new ideas compared to common accuracy proofs. If the technical points of the main proof of the algorithm are not in the reader's interest, he or she can skip it at first reading this article. Let us anyway point out that the proof of the accuracy of the range reduction (lemma 2.8, page 12) differs significantly from the point of views of other authors (cf. [6]). In a second step (beginning on page 36), we will prove the correctness of the rounding in the cases where the table maker's dilemma can be observed with a critical precision of up to 157 bits. This part of the article is particularly important since the accuracy proof can only be done by means of a somewhat new technique developed. The final correctness theorem is theorem 2.24, page 39, it uses theorems 2.22, page 36, and 2.23, page 36. To conclude, we will give an overview of the testing and timing results in comparision to the algorithms presented by others.

# 2 The algorithm

The algorithm for the correctly rounded exp function has been written in assembler Itanium but other platforms could also be used if they support some features of modern floating point units such as fma, extended precision and perhaps, for performance reasons, also several different floating point status (control) registers.

Generally speaking the algorithm is a table driven one which is common use for an implentation of the exponential function [1, 3, 4]. A 6 degree polynomial is used for the approximation of the reduced argument, almost all calculations are carried out in an internal representation of intermediate results as a non-evaluated sum of two double extended floating point registers.

Similarly to less accurate implementations, one has to consider very precisely all floating point calculations while trying to optimize for performance; in contrast the length of a formal proof of the accuracy is more than twice the one needed for simpler implementations. For the final rounding, the algorithm relies on the correctness of the underlying floating point hardware only and does not check if the rounding can actually be done without committing an error as others like [6] do.

### 2.1 General overview of the algorithm

The general idea of the algorithm can be seen in the following equation — the argument x is decomposed by range reduction into several parts which are used for indexing (by  $i_1$  and  $i_2$ ) two tables of precalculated values and for calculating an approximation to the exponential function on a small domain by evaluation of a polynomial:

$$e^{x}=2^{M}\cdot2^{\frac{i_{1}}{2^{7}}}\cdot2^{\frac{i_{2}}{2^{14}}}\cdot\left(1+p\left(r\right)\right)\cdot\left(1+x^{l}\right)+\Delta$$

In this equation, the values M,  $i_1$ ,  $i_2$ , r and  $x^l$  constitute the result of the range reduction done on x as follows<sup>3</sup>:

$$k = \left[ x \cdot \frac{2^{14}}{\ln 2} \right]$$

$$x = k \cdot \frac{\ln 2}{2^{14}} + r + x^{l} + \tau$$

$$k = 2^{14} \cdot M + 2^{7} \cdot i_{1} + i_{2}$$

where  $i_1, i_2 \in \mathbb{N} \cap [0; 2^7 - 1]$  and  $M \in \mathbb{N}$ .

The variables  $\Delta$  and  $\tau$  stand for the errors induced by the floating point arithmetic and the mathematical error of a polynomial approximation.

This general outline of the algorithm is an adapted version of other algorithms such as the algorithm for single precision presented in [1]. The choice of a range reduction using a scale constant of  $\frac{\ln 2}{2^{14}}$  is the result of a relatively complex study on the following four points that infere on this issue: the size of the two tables which can be optimized when an even scale constant exponent, 14, is used, the degree of the polynomial which depends on the size of the maximum magnitude of the final reduced argument r, the degree of the lower

$$k = |t| \Leftrightarrow k \in \mathbb{N}$$
 so that  $\neg \exists k' \in \mathbb{N}. |k' - t| < |k - t|$ 

<sup>&</sup>lt;sup>3</sup>Throughout this article we will make a light abuse of the gaussian floor value notation: we define

part reduced argument  $x^l$  approximation and some storage issues encountered with the scale constant  $\frac{\ln 2}{214}$ .

The polynomial used for approximating the exponential function on the reduced argument r is a modified 6 degree minimax polynomial obtained by Remez approximation as described in [2]. The algorithm calculates it in the following form:

$$p(r) = r + \frac{1}{2}r^2 + r^3 \cdot ((a_4^h + a_4^l) + (a_5 + (a_6 + a_7 \cdot r) \cdot r) \cdot r)$$

As one will expect the values for  $a_4^h$ ,  $a_4^l$ ,  $a_5$ ,  $a_6$  and  $a_7$  are near to respectively  $\frac{1}{6}$ ,  $\frac{1}{24}$ ,  $\frac{1}{120}$  and  $\frac{1}{720}$ ; the exact values, which differ slitly from the values calculated by the Remez algorithm since they must be represented in working precision, will be given below. The reason for not using Horner's polynomial evaluation form to the very end is the complete sequenciality of this algorithm. In order to win some time on a fully pipelined processor such as the Intel Itanium, we split up the evaluation in the way given. Finer approaches exist [4, 20] but they are merely useful if a higher precision presentation of the intermediate results is used as we do. The instruction sequence carrying out the calculation of this polynomial gives as a result two double extended precision numbers  $p^h$  and  $p^l$  whose sum represents a approximation to the value of the polynomial. This instruction sequence is the most time consuming phase of the algorithm and the most difficult in terms of the proof of its accuracy.

The two values  $t_1^h + t_1^l = 2^{\frac{i_1}{2^l}} + \delta$  and  $t_2^h + t_2^l = 2^{\frac{i_2}{2^{l4}}} + \delta$  are read in two tables of 128 entries each, where they are stored as two double extended precision numbers. They are multiplied using another instruction sequence to obtain two double extended numbers  $t^h + t^l = (t_1^h + t_1^h) \cdot (t_2^h + t_2^l) + \Delta$  which will be used in the final reconstruction step that calculates the product of  $t_2^h + t_2^l$ ,  $1 + (p^h + p^l)$  and  $1 + x^l$  to lead to a value which must simply be multiplied by  $2^M$  and rounded to get an approximation to the exponential which is (in the most cases) good enough to be correctly rounded to double precision.

The size of the table is  $2 \cdot 128 \cdot 2 \cdot 16 = 8192$  bytes which is a relatively great value [6, 1] for an algorithm for the exponential function. This is in other words the prize to pay for correctly rounded results. On the other hand, the table could fit 12 times in the L2 cache<sup>4</sup> of the Itanium processor which can be accessed in only 6 cycles.[11] Furthermore, its size is less than the sizes of the tables used by other algorithms proposed by Defour [6] and Ziv.[18]

The instruction sequences given in the different parts of the following accuracy proof are joined by some few other instructions needed for indexing the table, loading the constants needed etc. We assume that the reader will be able to figure out their use in the complete algorithm listing (cf. 7) and to convince himself of the correctness of this instructions. In addition, the final algorithm to used on a Itanium system has been scheduled in order to get a maximum performance. As a result of scheduling, the different part such as they are presented here are somewhat 'interlaced' which does not improve the readability of the code unfortunately.

<sup>&</sup>lt;sup>4</sup>The processor cannot load floating point registers from L1 cache. [11]

### 2.2 Proof of the accuracy of the algorithm

In order to prove in the end of this section, that our algorithm correctly calculates the exponential function exp in double precision for the main part of the input domain, we will first give some general results and assumptions, and than give a complete error estimate of each of the parts of the algorithm. Finally, an over all estimate will be done.

Throughout the following, two different, concurrent notations will be used. The first one comes close to Intel Itanium assembler code and is used as a reference in the proof. The second one, makes abstraction of assembly language by being more close to a mathematical notation. The main operations will be defined below but the following conventions will be used:

- Rounding a higher or infinite precision value  $\hat{x}$  to a floating point format offering n bits of mantissa will be noted:  $x \leftarrow \langle \hat{x} \rangle_n$ . If the context permits it, the indication of the resulting precision will be left out.
- The arithmetical operators corresponding to the mathematical operations +, and  $\cdot$  will be noted  $\oplus$ ,  $\ominus$  and  $\otimes$ .

**Definition 2.1** Let a and b be two double extended precision numbers. So the instruction noted

fadd.s1 c = a, b 
$$c \leftarrow a \oplus b$$

will calculate a double extended precision number c so that

$$c = (a+b) \cdot (1+\epsilon)$$

holds with  $|\epsilon| \leq 2^{-64}$  as long as the result does not under- or overflow.

**Definition 2.2** Let a, b and c be three double extended precision numbers. So the instruction

fma.s1 d = a, b, c 
$$d \leftarrow \langle a \cdot b + c \rangle$$

will calculate a double extended number d so that

$$d = (a \cdot b + c) \cdot (1 + \epsilon)$$

holds with  $|\epsilon| \leq 2^{-64}$  and that there is no intermediate rounding between the calculation of the product and the sum.

The same property can be observed for the fms instruction which calculates  $a \cdot b - c$ .

**Lemma 2.3** Let a and b be two double extended precision numbers.

So the instruction sequence

fma.s1 c = a, b, f0 
$$c \leftarrow \langle a \cdot b + 0 \rangle$$
 fms.s1 d = a, b, c 
$$d \leftarrow \langle a \cdot b - c \rangle$$

calculates two double extended numbers c and d so that the equations

$$c + d = a \cdot b$$

and

$$|d| \le |c| \cdot 2^{-64}$$

hold and c is the double extended nearest to  $a \cdot b$ .

**Proof** We know that the first instruction of the sequence calculates c so that

$$c = a \cdot b \cdot (1 + \epsilon)$$

with  $|\epsilon| \leq 2^{-64}$ . Thus c is trivially the double extended number nearest to  $a \cdot b$ .

We know also that there is no immediate rounding in the calculation between the calculation of  $a \cdot b$  and the substraction with c in the second instruction. It can be clearly seen that two double extended precision numbers multiplied in infinite precision, produce a result that has at most 128 significative bits. As the first 64 bits of the infinite precision product of a and b all cancellate with c, there are only 64 bits left to be "rounded" to the 64 bits of the mantissa of d. Hence the result follows.

This instruction sequence will be called below the Fast2Mult - sequence and noted also as  $c + d \leftarrow Fast2Mult$  (a, b).

**Lemma 2.4** Let a and b be two double extended numbers so that |a| > |b|. So the instruction sequence

$$\begin{array}{lll} \texttt{fadd.s1} & \texttt{c} = \texttt{a, b} & & & & & & & c \leftarrow a \oplus b \\ \texttt{fsub.s1} & \texttt{t} = \texttt{c, a} & & & & & t \leftarrow c \ominus a \\ \texttt{fsub.s1} & \texttt{d} = \texttt{b, t} & & & & d \leftarrow b \ominus t \end{array}$$

calculates two double extended precision numbers c and d so that the equations

$$c + d = a + b$$

and

$$|d| \le |c| \cdot 2^{-64}$$

hold and that c is the double extended precision number nearest to a + b.

**Proof** This property has been shown by Knuth, Møller and Dekker. [4, 12, 13, 21]

This instruction sequence will be called below the Fast2Sum - sequence and noted also as  $c+d \leftarrow Fast2Sum(a,b)$ .

Corollary 2.5 Let a and b be two double extended numbers. So the instruction sequence

```
\begin{array}{lll} {\rm fadd.s1\ c} = {\rm a,\ b} & c \leftarrow a \oplus b \\ & {\rm famin.s1\ t\_1} = {\rm a,\ b} & t_1 \leftarrow x\ so\ that\ x \in \{a,b\} \land\\ & \neg \exists x' \in \{a,b\}. |x'| < |x| \\ & {\rm famax.s1\ t\_2} = {\rm b,\ a} & t_2 \leftarrow x\ so\ that\ x \in \{b,a\} \land\\ & \neg \exists x' \in \{b,a\}. |x'| > |x| \\ & {\rm fsub.s1\ t\_3} = {\rm t\_2,\ c} & t_3 \leftarrow t_2 \ominus c \\ & {\rm fadd.s1\ d} = {\rm t\_3,\ t\_1} & d \leftarrow t_3 \oplus t_1 \end{array}
```

calculates two double extended precision numbers c and d so that the equations

$$c + d = a + b$$

and

$$|d| < |c| \cdot 2^{-64}$$

hold and that c is the double extended precision number nearest to a + b.

**Proof** As one can read in [4], this corollary is a trivial result of the previous Lemma 2.4 and a code sequence determining the minimum and maximum of the absolute value of two double extended numbers by means of the famin and famax instruction. [4] precises that the order of the arguments of the famin must be opposite to that one in which they are given to the famax instruction, this subtility has been respected.

**Remark:** The preceding instruction sequence is relatively long. Though having the same latency than the uncondition version of the sequence, it should be avoided as it makes a higher use of the processor's ressources thus perventing a easy scheduling of the englobing code. It can be eluded by analysing at compile time the magnitudes of the arguments a and b. A positive side of the sequence is that the high part of the result, c, is available after 4-5 cycles, thus the latency of the second result can usually be "hidden" in the latency of other calculations.

We will call this algorithm the *conditional Fast2Sum* sequence and note it also  $c+d \leftarrow \textit{CondFast2Sum}(a,b)$ .

### Theorem 2.6 Let

```
a_4^h = \frac{12297829382473034411}{73786976294838206464}
a_4^l = \frac{-3098113767111307095}{680564733841876926926749214863536422912}
a_5 = \frac{12297829382473034411}{295147905179352825856}
```

$$a_6 = \frac{4919131753080926207}{590295810358705651712}$$

$$a_7 = \frac{13117684675687318145}{9444732965739290427392}$$

and let  $x \in \left[-\frac{\ln 2}{2^{15}}; \frac{\ln 2}{2^{15}}\right]$ . The polynomial

$$p(x) = x + \frac{1}{2}x^2 + x^3 \cdot \left( \left( a_4^h + a_4^l \right) + \left( a_5 + \left( a_6 + a_7 \cdot x \right) \cdot x \right) \cdot x \right)$$

approximates  $e^x - 1$  so that the inegality

$$|e^x - 1 - p(x)| < 2^{-123}$$

holds and the values  $a_4^h$ ,  $a_4^l$ ,  $a_5$ ,  $a_6$ ,  $a_7$  are all exactly representable in double extended precision.

In addition, for  $x \in [-2^{-30}; 2^{-30}]$  the inegality holds with

$$|e^x - 1 - p(x)| < 2^{-161}$$

**Proof** This property can simply be proven by locating numerically the local maximum values of  $|e^x - 1 - p(x)|$  in the given intervals with a tool such as Maple.

The fact that the polynomial coefficients are all representable in double extended precision can trivially be verified by converting them to this format and calculating the rounding error, which must be zero.

#### Lemma 2.7 Let

$$l^h = \frac{3196577161300663915}{75557863725914323419136}$$

and

$$l^l = \frac{-15596301547560248643}{22300745198530623141535718272648361505980416}$$

So the following inequation holds

$$\left| \frac{\ln 2}{2^{14}} - \left( l^h + l^l \right) \right| < 2^{-150}$$

 $l^h$  and  $l^l$  are exactly representable in double extended precision and  $l^h$  is the double extended number nearest to  $\frac{\ln 2}{2^{14}}$ .

**Proof** Trivial, one has only to calculate the given difference and to test if the values are really representable in double extended precision.

**Lemma 2.8** Let x be a double precision floating point number in the range  $x \in [-745.13; 709.78]^5$ normalized to register format,

let inv\_ln2 be the double extended precision number nearest to  $\frac{1}{\ln 2}$ ,

let  $l^h$  be the double extended precision number nearest to  $\frac{\ln 2}{2^{14}}$ ,

let  $l^l$  be the double extended number so that  $l^h + l^l = \frac{\ln 2}{2!4} + \delta$  with  $|\delta| < 2^{-150}$  and  $|l^l| < |l^h| \cdot 2^{-64}$ 

let fRSH\_2\_49 be the double extended number representing  $1.5 \cdot 2^{112}$ ,

let frshf be the double extended number for  $1.5 \cdot 2^{63}$  and

let  $f2_M_49$  be the double extended number  $2^{-49}$ .

Then, the following instruction sequence calculates two double extended numbers r and  $x^l$ so that

$$x = \left| x \cdot \frac{2^{14}}{\ln 2} \right| \cdot \frac{\ln 2}{2^{14}} + r + x^l + \Delta$$

holds with

$$|\Delta| < 2^{-118}$$

or with

$$e^{r+x^l} = e^{\hat{r}} \cdot (1+\xi)$$

where  $|\xi| < 2^{-118}$  and  $\hat{r} = x - \left| x \cdot \frac{2^{14}}{\ln 2} \right| \cdot \frac{\ln 2}{2^{14}}$ .

In both cases we have  $|r| < \frac{\ln 2}{2^{15}}$  and  $|x^{\vec{l}}| < |r| \cdot 2^{-64}$ . In addition, for  $x \in \left[-2^{-30}; 2^{-30}\right]$ , the instruction sequence calculates r and  $x^l$  so that the following equalities hold exactly:

$$r = x$$
$$x^l = 0$$

and that k=0.

Instruction sequence:

$$\begin{array}{lll} \text{fma.s1 q.1 = x, inv_ln2, fRSHF_2_49} & q_1 \leftarrow \langle x \cdot inv\_ln2 + fRSHF\_2\_49 \rangle \\ \text{fms.s1 k = q.1, f2_M_49, fRSHF} & k \leftarrow \langle q_1 \cdot f2\_M\_49 - fRSHF \rangle \\ \text{fnma.s1 r.1 = k, f1_1, f0} & r^l \leftarrow \langle -k \cdot l^l + 0 \rangle \\ \text{fnma.s1 r.h = k, f1_h, x} & r^h \leftarrow \langle -k \cdot l^h + x \rangle \\ \text{fadd.s1 r = r.h, r.1} & \\ \text{famin.s1 q.5.0 = r.h, r.1} & \\ \text{famax.s1 q.5.1 = r.1, r.h} & \\ \text{fsub.s1 q.5.2 = q.5.1, r} & \\ \text{fadd.s1 x.1 = q.5.2, q.5.0} & r + x^l \leftarrow \textit{CondFast2Sum} \left(r^h, r^l\right) \\ \end{array}$$

<sup>&</sup>lt;sup>5</sup>i.e. the range in which  $e^x$  is representable in double precision or is not simply zero (resp. 0+1ulp for some rounding modes).

#### Proof

The last 5 instructions of the given sequence are the *conditional Fast2Sum* sequence which is correct on all arguments. This sequence ensures that  $|x^l| \leq |r| \cdot 2^{-64}$  and thus  $|x^l| < 2^{-79}$  if  $|r| < 2^{-15}$  which can easily be verified. So it suffices to prove that

$$x = \left| x \cdot \frac{2^{14}}{\ln 2} \right| \cdot \frac{\ln 2}{2^{14}} + r^h + r^l + \Delta$$

with  $|\Delta| < 2^{-118}$  and that  $|r^h| < |r^l|$ .

Let us first show that the first 2 steps of the instruction sequence correctly calculate  $k = \left| x \cdot \frac{2^{14}}{\ln 2} \right|$ . Let us note the rounded result  $\langle z \rangle$  of the mathematical value z. So we have

$$q_1 = \left\langle x \cdot \frac{1}{\ln 2} + 1.5 \cdot 2^{112} \right\rangle$$

and we know that  $\mathrm{1ulp}(q_1)=2^{112-63}=2^{49}$  thus the lower part of the double extended number (when we not consider the 2 leading ones of the  $1.5\cdot 2^{112}$  part) contains  $\left\lfloor x\cdot \frac{2^{14}}{\ln 2}\right\rfloor$  scaled by  $2^{49}$ . In fact, in the next instruction, the value  $q_1$  is rescaled by  $2^{-49}$  and the trailing ones are removed by substraction of  $1.5\cdot 2^{63}$ . So k contains the integer value nearest to  $x\cdot \frac{2^{14}}{\ln 2}$ .

Let us show now, that  $r^h + r^l = \left(x - k \cdot \frac{\ln 2}{2^{14}}\right) + \Delta$  with  $|\Delta| < 2^{-118}$ . One can simply verify that due to the restricted range of the value x, we can assume that  $k \in \left[-2^{25}; 2^{25}\right]$ . Further, because  $\left[x \cdot \frac{2^{14}}{\ln 2}\right] \cdot \frac{\ln 2}{2^{14}}$  is a very good approximation to x (cf. [2]) and because the intermediate calculations during a fma instruction are carried out in infinite precision, we can assume that the result of the third instruction is exactly  $r^h = -k \cdot l^h + x$ .

Additionally, the use of the fma instruction dispenses us from storing  $l^h$  with some trailing zeros as [1, 14, 15, 6] do and we can further assume that the significant bits debording from a 64 bit representation which are a result form the intermediate multiplication of  $l^h$  by k cannot lead to a complete cancellation and are not lost to the final result. This behaviour leads to a significative simplification of the range reduction sequence in comparision to e.g. [6]. Therefore, as [2] notices, too, it is not necessary to use methods such as the Payne and Hanek algorithm for the range reduction of the exponential function. For instance, even if Kahan's algorithm calculating the maximal number of cancelled bits [2] gives us the number of 72 cancelled bits, this cancellation is not a problem. Looking at the reduction formula, which we consider here as a mathematically exact proposition,

$$r = x - \left\lfloor x \cdot \frac{2^{14}}{\ln 2} \right\rfloor \cdot \frac{\ln 2}{2^{14}}$$

one sees that the cancellation on the arithmetical computation of an approximation to r is the greater the term  $\left\lfloor x \cdot \frac{2^{14}}{\ln 2} \right\rfloor \cdot \frac{\ln 2}{2^{14}}$  is nearer to x and thus the cancellation is important only

<sup>&</sup>lt;sup>6</sup>For a pedantic proof we could use a similiar argumentation as in [8] which is based on a lemma proven by Sterbenz in [16].

if the real reducted argument r is very small. In other words we have cancellation only iff the functional argument x is very near to a table entry value. Since we have  $e^r = \sum_{i=0}^{\infty} \frac{1}{i!} r^i =$ 

 $1+r+\frac{1}{2}r^2+\ldots$ , the impact of the reduced argument r, |r|<1, on the final result for  $e^x$  will be very small (the leading 1 is much greater in magnitude than r or even  $r^2$ ) and even more, the impact of the error made due to cancellation on the final result of the exponential function after the multiplication by the table values will be so small that we don't have to care too much about it. What matters is the absolute error of the arithmetically calculated reduced argument  $r^h+r^l$  in comparison to the exact real value  $x-\left\lfloor x\cdot\frac{2^{14}}{\ln 2}\right\rfloor\cdot\frac{\ln 2}{2^{14}}$ , which we are going to give the bound of  $2^{-118}$  for.

Let us consider this issue in a more formal way by dealing not with the absolute but with the relative error impact of the cancellation on the final result. If we note  $\hat{r}$  the mathematically exact value of the reduced argument, we observe

$$r^h + r^l = \hat{r} \cdot (1 + \epsilon)$$

where  $\epsilon$  is the relative error of the reduced argument. Using this, we can approximate formally the impact of this error on the relative error  $\xi$  of the final result:

$$e^{r^h+r^l}=e^{\hat{r}\cdot(1+\epsilon)}=e^{\hat{r}}\cdot e^{\hat{r}\epsilon}=e^{\hat{r}}\cdot\left(1+\hat{r}\epsilon+\frac{1}{2}\hat{r}^2\epsilon^2+\ldots\right)$$

Noting

$$\xi = \hat{r}\epsilon + \frac{1}{2}\hat{r}^2\epsilon^2 + \ldots = \hat{r}\epsilon \left(1 + \frac{1}{2}\hat{r}\epsilon + \frac{1}{6}\hat{r}^2\epsilon^2 \ldots\right)$$

we have

$$e^{r^h + r^l} = e^{\hat{r}} \cdot (1 + \xi)$$

and we are able to give the following estimate:

$$|\xi| = |\hat{r}| \cdot |\epsilon| \cdot \left| 1 + \frac{1}{2} \hat{r} \epsilon + \frac{1}{6} \hat{r}^2 \epsilon^2 \dots \right| < |\hat{r}| \cdot |\epsilon| \cdot 2$$

If we have j bits that are lost by cancellation then we still have (128 - j) correct bits of our potentially 128 bit precise result, so in this case

$$|\epsilon| < 2^{-128+j}$$

So if we want to have 118 correct bits in the final result, we must not loose more than j by cancellation for all  $\hat{r}$  in the following range

$$|\hat{r}| > 2^{9-j}$$

because if this condition is respected we obtain the desired result

$$|\mathcal{E}| < |\hat{r}| \cdot |\epsilon| \cdot 2 < 2^{9-j} \cdot 2^{-128+j} \cdot 2 = 2^{-118}$$

Let assume now that

$$|\hat{r}| = \left| x - \left| x \cdot \frac{2^{14}}{\ln 2} \right| \cdot \frac{\ln 2}{2^{14}} \right| > 2^{9-j}$$

and that we loose more than j bits by cancellation. Since  $r^h + r^l = \langle \hat{r} \rangle$  and  $|\hat{r}| < 2^{-15}$  we know that the most significant bit in  $r^h$  has a maximal weight of  $2^{-15}$ . So if j bits are cancelled, the final result  $r^h + r^l$  is in magnitude

$$|r^h + r^l| < 2^{-15-j}$$

but as we have assumed that  $|\hat{r}| > 2^{9-j}$ , we have a contradiction. We can therefore assume that the error due to cancellation in the range reduction phase does not affect the bits higher that bit 118.

So we have to consider only the error due to the rounding of  $l^h$  and  $l^l$ , which we will do now:

$$\begin{split} r^h + r^l &= -k \cdot l^h + x - k \cdot l^l + k \cdot l^l \cdot \epsilon \\ &= x - k \cdot \left( l^h + l^l \right) + k \cdot l^l \cdot \epsilon \\ &= x - k \cdot \left( \frac{\ln 2}{2^{14}} + \delta \right) + k \cdot l^l \cdot \epsilon \\ &= x - k \cdot \frac{\ln 2}{2^{14}} + k \cdot \delta + k \cdot l^l \cdot \epsilon \\ &= x - \left| x \cdot \frac{2^{14}}{\ln 2} \right| \cdot \frac{\ln 2}{2^{14}} + k \cdot \delta + k \cdot l^l \cdot \epsilon \end{split}$$

where  $|\epsilon| < 2^{-64}$  and  $|\delta| < 2^{-128}$ .

Further we know that  $|l^l| < |l^h| \cdot 2^{-64} \approx \frac{\ln 2}{2^{14}} \cdot 2^{-64} < 2^{-80}$ . Thus

$$\begin{split} |\Delta| &< |k \cdot \delta + k \cdot l^l \cdot \epsilon| \\ &< |k \cdot \delta| + |k \cdot l^l \cdot \epsilon| \\ &< 2^{25} \cdot 2^{-150} + 2^{25} \cdot 2^{-80} \cdot 2^{-64} < 2^{-118} \end{split}$$

For a complete proof of the lemma, we still have to show that for  $x \in [-2^{-30}; 2^{-30}]$  the value r = x and that  $x^l = 0$ . This can be shown relatively trivially: As  $|x| < 2^{-30}$  we have that

$$\left| x \cdot \frac{2^{14}}{\ln 2} \right| < \frac{1}{2}$$

so k will be

$$k = 0$$

Thus the result leading to  $r^l$  and  $r^h$  will give

$$r^l = 0$$

and

$$r^h = x$$

As we have shown that the additional *conditional Fast2Sum* sequence is errorless, the property follows.

**Remark:** Looking on the preceding instruction sequence one could suggest that it would suffice to take  $r^h$  and  $r^l$  as the higher and the lower part of the reduced argument. This would save us the use of the *conditional Fast2Sum* sequence whose use should be avoided as discussed above. Unfortunately this approach cannot be done because of the following reason: we know that  $r^l$  might be as great as  $2^{-56}$  in magnitude by  $r^l$ 

$$|r^l| = |l^l| \cdot |k| > 2^{-81} \cdot 2^{25} = 2^{-56}$$

With such a great lower part reduced argument, the quadratic term of the Taylor development of  $e^{x^l}$  would have to be evaluated to obtain the desired precision. Using  $x^l$  as a lower part reduced argument with  $|x^l| < 2^{-79}$  allows us to approximate  $e^{x^l}$  only by  $1 + x^l$  as we actually do.

Additionally, we cannot avoid to use the conditional version of the Fast2Sum sequence. As a result of cancellation,  $r^h$  can be less in magnitude than  $r^l$ . Though this case seems to be extremely rare, even almost impossible to our opinion, there is no mathematical reason that it cannot eventually happen. Further, the use of the  $conditional\ Fast2Sum$  algorithm is not very costly. As stated already above, we can hide the latency of the supplementary tests completely in the latency of the polynomial evaluations.

#### Theorem 2.9 Let

$$\begin{array}{rcl} a_4^h & \approx & \frac{1}{6} \\ a_4^l & \approx & a_4^h \cdot 2^{-64} \\ a_5 & \approx & \frac{1}{24} \\ a_6 & \approx & \frac{1}{120} \\ a_7 & \approx & \frac{1}{720} \\ h & = & \frac{1}{2} \end{array}$$

let x be a double extended precision number where  $x \in \left[-\frac{\ln 2}{2^{15}}; \frac{\ln 2}{2^{15}}\right]$  and let p(x) be the polynomial

$$p(x) = x + h \cdot x^2 + x^3 \cdot ((a_4^h + a_4^l) + (a_5 + (a_6 + a_7 \cdot x) \cdot x) \cdot x)$$

$$\exists x. |r^l| = |l^l| \cdot |k| > 2^{-81} \cdot 2^{25} = 2^{-56}$$

<sup>&</sup>lt;sup>7</sup>To be completely mathematically exact, we would have to quantify the proposition by an existential quantifier - in contrast to all other propositions in this paper which are implictly universally quantified:

So the following instruction sequence calculates two double extended numbers  $p^h$  and  $p^l$  so, that

$$p^h + p^l = p(x) + \Delta$$

holds with  $|\Delta| < 2^{-124}$ , that  $p^h$  is the double extended number nearest to p(x) and that  $|p^l| < |p^h| \cdot 2^{-64}$ .

In addition, for  $x \in [-2^{-30}, 2^{-30}]$  the arithmetical error  $\Delta$  of the sequence is less than

$$|\Delta| < 2^{-141}$$

Instruction sequence:

```
Step 1:
                                                                   z_1 \leftarrow \langle a_7 \cdot x + a_6 \ranglez_2 \leftarrow \langle z_1 \cdot x + a_5 \rangle
 fma.s1 z_1 = a_7, x, a_6
 fma.s1 z_2 = z_1, x, a_5
 fma.s1 z_3_h = z_2, x, f0
                                                                    z_3^h + z_3^l \leftarrow \textit{Fast2Mult}(z_2, x)
 fms.s1 z_3_1 = z_2, x, z_3_h
Step 2:
 fadd.s1 z_4 = a_4_h, z_3_h
 fsub.s1 z_5 = z_4, a_4_h
                                                                     z_4 + z_6 \leftarrow \textit{Fast2Sum}\left(a_4^h, z_3^h\right)
 fsub.s1 z_6 = z_3_h, z_5
                                                                    z_7 \leftarrow z_3^l \oplus z_6
 fadd.s1 z_7 = z_3_1, z_6
                                                                     z_8 \leftarrow a_4^l \oplus z_7
 fadd.s1 z_8 = a_4_1, z_7
 fadd.s1 z_9_h = z_4, z_8
 fsub.s1 z_10 = z_9_h, z_4
                                                                     z_{\scriptscriptstyle \mathrm{Q}}^h + z_{\scriptscriptstyle \mathrm{Q}}^l \leftarrow \mathit{Fast2Sum}(z_4, z_8)
 fsub.s1 z_9_1 = z_8, z_10
Step 3:
 fma.s1 z_11_h = x, x, f0
                                                                     z_{11}^h + z_{11}^l \leftarrow \textit{Fast2Mult}(x, x)
 fms.s1 z_11_1 = x, x, z_11_h
Step 4:
 fma.s1 z_12 = z_11_h, x, f0
                                                                    \begin{array}{l} z_{12} + z_{13} \leftarrow \textit{Fast2Mult}\left(z_{11}^h, x\right) \\ z_{14} \leftarrow \left\langle z_{11}^l \cdot x + z_{13} \right\rangle \end{array}
 fms.s1 z_13 = z_11_h, x, z_12
 fma.s1 z_14 = z_11_1, x, z_13
 fadd.s1 z_15_h = z_12, z_14
 fsub.s1 z_16 = z_15_h, z_12
                                                                     z_{15}^h + z_{15}^l \leftarrow \textit{Fast2Sum}(z_{12}, z_{14})
 fsub.s1 z_15_1 = z_14, z_16
Step 5:
 fma.s1 z_17 = z_9_h, z_15_h, f0
```

```
z_{17} + z_{18} \leftarrow \textit{Fast2Mult}\left(z_9^h, z_{15}^h\right)
 fms.s1 z_18 = z_9_h, z_15_h, z_17
                                                                z_{19} \leftarrow \left\langle z_9^l \cdot z_{15}^h + z_{18} \right\ranglez_{20} \leftarrow \left\langle z_9^h \cdot z_{15}^l + z_{19} \right\rangle
 fma.s1 z_19 = z_9_1, z_15_h, z_18
 fma.s1 z_20 = z_9_h, z_15_1, z_19
 fadd.s1 z_21_h = z_17, z_20
 fsub.s1 z_22 = z_21_h, z_17
                                                                z_{21}^h + z_{21}^l \leftarrow \textit{Fast2Sum}(z_{17}, z_{20})
 fsub.s1 z_21_1 = z_20, z_22
Step 6:
 fma.s1 z_23 = z_11_h, h, f0
                                                                z_{23} + z_{24} \leftarrow \textit{Fast2Mult}(z_{11}^h, h)
 fms.s1 z_24 = z_11_h, h, z_23
                                                                z_{25} \leftarrow \langle z_{11}^l \cdot h + z_{24} \rangle
 fma.s1 z_25 = z_11_1, h, z_24
 fadd.s1 z_26_h = z_23, z_25
 fsub.s1 z_27 = z_26_h, z_23
                                                                z_{26}^h + z_{26}^l \leftarrow \textit{Fast2Sum}(z_{23}, z_{25})
 fsub.s1 z_26_1 = z_25, z_27
Step 7:
 fadd.s1 z_28 = z_26_h, z_21_h
 fsub.s1 z_29 = z_28, z_26_h
                                                                z_{28} + z_{30} \leftarrow \textit{Fast2Sum}(z_{26}^h, z_{21}^h)
 fsub.s1 z_30 = z_21_h, z_29
                                                                z_{31} \leftarrow z_{21}^l \oplus z_{30}
 fadd.s1 z_31 = z_21_1, z_30
                                                                z_{32} \leftarrow z_{26}^l \oplus z_{31}
 fadd.s1 z_32 = z_26_1, z_31
 fadd.s1 z_33_h = z_28, z_32
 fsub.s1 z_43 = z_33_h, z_28
 fsub.s1 z_33_1 = z_32, z_34
                                                                z_{33}^h + z_{33}^l \leftarrow \textit{Fast2Sum}(z_{28}, z_{32})
Step 8:
 fadd.s1 z_35 = z_33_h, x
 fsub.s1 z_36 = z_35, x
                                                                z_{35} + z_{37} \leftarrow \textit{Fast2Sum}\left(z_{33}^h, x 
ight)
 fsub.s1 z_37 = z_33_h, z_36
                                                                z_{38} \leftarrow z_{33}^l \oplus z_{37}
 fadd.s1 z_38 = z_33_1, z_37
 fadd.s1 p_h = z_35, z_38
 fsub.s1 z_39 = p_h, z_35
                                                                p^h + p^l \leftarrow \textit{Fast2Sum}(z_{35}, z_{38})
 fsub.s1 p_1 = z_38, z_39
```

In order to be able to give a final proof of this theorem, we will use several lemmata for the different steps. The proof of the theorem will then simply consist in a summing up of the weighted sum of the different errors accumulated in the different steps.

**Lemma 2.10** The instruction sequence called "step 1" in the algorithm above calculates  $z_3^h$  and  $z_3^l$  so that

$$z_3^h + z_3^l = (a_5 + (a_6 + a_7 x) x) x + \Delta_1$$

holds with  $|\Delta_1| < 2^{-82}$  and that  $z_3^h$  is the double extended number nearest to the exact result.

**Proof** The last 2 instructions of this step form the Fast2Mult algorithm which has been proven above to be errorless. So we have:

$$z_3^h + z_3^l = x \cdot ((a_7x + a_6)(1 + \epsilon_1) + a_5) \cdot (1 + \epsilon_2)$$
  
= ...  
=  $(a_5 + (a_6 + a_7x)x)x + \Delta_1$ 

where

$$\Delta_1 = a_7 x^3 \epsilon_1 + a_6 x^2 \epsilon_1 + a_5 x \epsilon_2 + a_7 x^3 \epsilon_2 + a_6 x^2 \epsilon_2 + a_7 x^3 \epsilon_1 \epsilon_2 + a_6 x^2 \epsilon_1 \epsilon_2$$

with  $|\epsilon_1| < 2^{-64}$  and  $|\epsilon_2| < 2^{-64}$ . Since

$$|\Delta_1| = |a_7 x^3 \epsilon_1| + |a_6 x^2 \epsilon_1| + |a_5 x \epsilon_2| + |a_7 x^3 \epsilon_2| + |a_6 x^2 \epsilon_2| + |a_7 x^3 \epsilon_1 \epsilon_2| + |a_6 x^2 \epsilon_1 \epsilon_2|$$

and

$$|a_7 x^3 \epsilon_1| < \frac{1}{720} \cdot 2^{-46} \cdot 2^{-64} < 2^{-109}$$

$$|a_6 x^2 \epsilon_1| < 2^{-101}$$

$$|a_5 x \epsilon_2| < 2^{-83}$$

$$|a_7 x^3 \epsilon_2| < 2^{-109}$$

$$|a_6 x^2 \epsilon_2| < 2^{-101}$$

$$|a_7 x^3 \epsilon_1 \epsilon_2| < 2^{-160}$$

$$|a_6 x^2 \epsilon_1 \epsilon_2| < 2^{-150}$$

we have

$$|\Delta_1| < 2^{-109} + 2^{-101} + 2^{-83} + 2^{-109} + 2^{-101} + 2^{-160} + 2^{-150} < 2^{-82}$$

**Lemma 2.11** The sequence called "step 2" in the algorithm above calculates the values  $z_9^h$  and  $z_9^l$  so that

$$z_9^h + z_9^l = \left( \left( a_4^h + a_4^l \right) + \left( z_3^h + z_3^l \right) \right) + \Delta_2$$

holds with  $|\Delta_2| < 2^{-130}$  and that  $z_9^h$  is the double extended number nearest to the exact result.

**Proof** The first three and the last three instructions of the step are the *Fast2Sum* algorithm. To ensure that the results it produces are correct we must prove that the conditions on the magnitude of its input values are respected.

We have:

$$|a_4^h| \approx \frac{1}{6}$$
$$|z_3^h| \approx |a_5 x + \delta|$$

so one can easily see that the input condition is respected. Secondly, we have

$$|z_4| \approx |a_4^h + z_3^h|$$

$$|z_8| \le |a_4^l + z_3^l + (a_4^h + z_3^h) \cdot 2^{-64}| < 3 \cdot |a_4^h + z_3^h| \cdot 2^{-64}$$

so the input condition is respected also for the second utilisation of the Fast2Sum algorithm. Thus we can assume that we have

$$z_4 + z_6 = a_4^h + z_3^h$$

exactly and that it suffices to show that

$$z_4 + z_8 = ((a_4^h + a_4^l) + (z_3^h + z_3^l)) + \Delta_2$$

Hence

$$z_4 + z_8 = z_4 + (a_4^l + (z_3^l + z_6) (1 + \epsilon_1)) (1 + \epsilon_2)$$

$$= \dots$$

$$= z_4 + z_6 + a_4^l + z_3^l + \Delta_2$$

$$= \dots$$

$$= ((a_4^h + a_4^l) + (z_3^h + z_3^l)) + \Delta_2$$

where  $\Delta_2$  is

$$\Delta_2 = z_3^l \epsilon_1 + z_6 \epsilon_1 + a_4^l \epsilon_2 + z_3^l \epsilon_2 + z_6 \epsilon_2 + z_3^l \epsilon_1 \epsilon_2 + z_6 \epsilon_1 \epsilon_2$$

We have

$$\begin{split} |z_3^l \epsilon_1| &< 2^{-148} \\ |z_6 \epsilon_1| &< 2^{-132} \\ |a_4^l \epsilon_2| &< 2^{-132} \\ |z_3^l \epsilon_2| &< 2^{-148} \\ |z_6 \epsilon_2| &< 2^{-132} \\ |z_3^l \epsilon_1 \epsilon_2| &< 2^{-200} \\ |z_6 \epsilon_1 \epsilon_2| &< 2^{-196} \end{split}$$

Therefore

$$|\Delta_2| < 2^{-131} + 2^{-147} + 2^{-196} + 2^{-200} < 2^{-130}$$

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**Lemma 2.12** The instruction sequence called "step 3" in the algorithm given above calculates  $z_{11}^h$  and  $z_{11}^l$  so that

$$z_{11}^h + z_{11}^l = x^2$$

exactly and that  $z_{11}^h$  is the double extended precision number nearest to  $x^2$ .

**Proof** Trivial, the instructions sequence is the *Fast2Mult* algorithm whose correctness has already been proven.

**Lemma 2.13** The instruction sequence labelled "step 4" in the given algorithm calculates  $z_{15}^h$  and  $z_{15}^l$  so that

 $z_{15}^h + z_{15}^l = (z_{11}^h + z_{11}^l) \cdot x + \Delta_4$ 

holds with  $|\Delta_4| < 2^{-173}$  and that  $z_{15}^h$  is the double extended precision number nearest to the exact result.

**Proof** One notices that the first two lines of the step are the *Fast2Mult* algorithm and that the last three constitute the *Fast2Sum* algorithm. So it suffices to prove the input conditions and to estimate the error due to the other instruction. Concerning the input condition, we have:

$$|z_{12}| \approx |z_{11}^h \cdot x|$$
  
 $|z_{14}| \le |z_{11}^l \cdot x + z_{11}^h \cdot x \cdot 2^{-64}| \approx |z_{11}^h \cdot x| \cdot 2^{-63}$ 

so the input condition is respected.

Thus, as we can assume a correct result for

$$z_{12} + z_{13} = z_{11}^h \cdot x$$

we observe the following

$$z_{12} + z_{14} = z_{12} + (z_{11}^{l} \cdot x + z_{13}) (1 + \epsilon_{1})$$

$$= \dots$$

$$= (z_{11}^{h} + z_{11}^{l}) \cdot x + \Delta_{4}$$

where  $\Delta_4$  is

$$\Delta_4 = z_{11}^l x \epsilon_1 + z_{13} \epsilon_1$$

with  $|\epsilon_1| < 2^{-64}$ .

Since

$$|z_{11}^l x \epsilon_1| < 2^{-174}$$
$$|z_{13} \epsilon_1| < 2^{-174}$$

we have the result  $|\Delta_4| < 2^{-173}$ .

**Lemma 2.14** The instruction sequence named "step 5" calculates two double extended numbers  $z_{21}^h$  and  $z_{21}^l$  so that

$$z_{21}^h + z_{21}^l = (z_{15}^h + z_{15}^l) \cdot (z_9^h + z_9^l) + \Delta_5$$

holds with  $|\Delta_5| < 2^{-173}$  and that  $z_{21}^h$  is the double extended number nearest to the exact result.

**Proof** The first two lines of the step are the Fast2Mult sequence, the last three are the Fast2Sum algorithm. So it suffices to show that the input condition of the Fast2Sum algorithm is respected and to estimate the error induced by the other 2 operations. Concerning the input conditions we observe:

$$|z_{17}| \approx |z_9^h \cdot z_{15}^h|$$

$$|z_{20}| < |z_9^h \cdot z^l 15 + z_9^l \cdot z_{15}^l + z_9^h \cdot z_{15}^h \cdot 2^{-64}| \le |z_9^h \cdot z_{15}^h| \cdot 2^{-63}$$

thus the condition on the magnitude of the input values is respected. Since we have an exact result for

$$z_{17} + z_{18} = z_9^h \cdot z_{15}^h$$

we can deduce

$$z_{17} + z_{20} = z_{17} + \left(z_9^h \cdot z_{15}^h + \left(z_9^l \cdot z_{15}^h + z_{18}\right)(1 + \epsilon_1)\right)(1 + \epsilon_2)$$

$$= \dots$$

$$= z_9^h \cdot z_{15}^h + z_9^h \cdot z_{15}^l + z_9^l \cdot z_{15}^h +$$

$$z_9^l \cdot z_{15}^l - z_9^l \cdot z_{15}^l + z_9^l \cdot z_{15}^h \cdot \epsilon_1 +$$

$$z_{18} \cdot \epsilon_1 + z_9^h \cdot z_{15}^l \cdot \epsilon_2 + z_9^l \cdot z_{15}^h \cdot \epsilon_2 +$$

$$z_{18} \cdot \epsilon_2 + z_9^l \cdot z_{15}^h \cdot \epsilon_1 \epsilon_2 + z_{18} \cdot \epsilon_1 \epsilon_2$$

$$= \left(z_{15}^h + z_{15}^l\right) \cdot \left(z_9^h + z_9^l\right) + \Delta_5$$

where  $\Delta_5$  is

$$\Delta_5 = -z_9^l z_{15}^l + z_9^l z_{15}^h \epsilon_1 + z_{18} \epsilon_1 + z_9^h z_{15}^l \epsilon_2 + z_9^l z_{15}^h \epsilon_2 + z_{18} \epsilon_2 + z_9^l z_{15}^h \epsilon_1 \epsilon_2 + z_{18} \epsilon_1 \epsilon_2$$

with  $\epsilon_1 < 2^{-64}$  and  $\epsilon_2 < 2^{-64}$ .

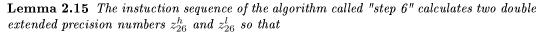
With the following estimates

$$\begin{split} |-z_9^l z_{15}^l| &< 2^{-176} \\ |z_9^l z_{15}^h \epsilon_1| &< 2^{-244} \\ |z_{18} \epsilon_1| &< 2^{-176} \\ |z_9^h z_{15}^l \epsilon_2| &< 2^{-176} \end{split}$$

$$\begin{split} |z_9^l z_{15}^h \epsilon_2| &< 2^{-176} \\ |z_{18} \epsilon_2| &< 2^{-176} \\ |z_9^l z_{15}^h \epsilon_1 \epsilon_2| &< 2^{-244} \\ |z_{18} \epsilon_1 \epsilon_2| &< 2^{-244} \end{split}$$

we get

$$|\Delta_5| < 2^{-173}$$



$$z_{26}^h + z_{26}^l = h \cdot (z_{11}^h + z_{11}^l) + \Delta_6$$

holds with  $|\Delta_6| < 2^{-159}$  and that  $z_{26}^h$  is the double precision number nearest to the exact result.

**Proof** One remarks that the first two lines in this step are the *Fast2Mult* sequence and that the last three are the *Fast2Sum* algorithm. So it suffices to show that the input condition of the *Fast2Sum* algorithm is respected to be able to assume correct results for these two parts of the step.

Let us first show the input condition:

We have

$$|z_{23}| \approx \left| \frac{1}{2} \cdot z_{11}^h \right|$$

$$|z_{25}| \approx \left| \frac{1}{2} \cdot z_{11}^l + \frac{1}{2} \cdot z_{11}^h \cdot 2^{-64} \right| < |z_{11}^h \cdot 2^{-64}|$$

Thus the input condition is respected.

So we have

$$z_{23} + z_{24} = h \cdot z_{11}^h$$

exactly and therefore

$$z_{23} + z_{25} = z_{23} + (z_{11}^l \cdot h + z_{24}) (1 + \epsilon_1)$$

$$= \dots$$

$$= h \cdot (z_{11}^h + z_{11}^l) + \Delta_6$$

where  $\Delta_6$  is  $\Delta_6 = h \cdot z_{11}^l \cdot \epsilon_1 + z_{24} \cdot \epsilon_1$  with  $\epsilon_1 < 2^{-64}$ 

One can easily check that

$$|h \cdot z_{11}^l \cdot \epsilon_1| < 2^{-160}$$
$$|z_{24} \cdot \epsilon_1| < 2^{-160}$$

so we have as a result

$$|\Delta_6| < 2^{-159}$$

**Lemma 2.16** The instruction sequence called "step 7" in the algorithm given above calculates two double extended numbers  $z_{33}^h$  and  $z_{33}^l$  so that

$$z_{33}^h + z_{33}^l = ((z_{26}^h + z_{26}^l) + (z_{21}^h + z_{21}^l)) + \Delta_7$$

holds with  $|\Delta_7| < 2^{-158}$  and that  $z_{33}^h$  is the double extended precision number nearest to the exact result.

**Proof** As one can see, the first three and the last three instructions in the sequence of step 7 are two times the Fast2Sum sequence. We will first check their input condition:

$$|z_{26}^h| \approx |h \cdot x^2| \approx \frac{1}{2} \cdot x^2$$
  
 $|z_{21}^h| \approx |x^3 \cdot (a_4 + (a_5 + (a_6 + a_7 x) x) x)|$ 

To prove that  $|z_{26}^h| > |z_{21}^h|$ , we locate numerically the minimum of

$$\frac{1}{2} \cdot x^2 - \left| x^3 \cdot (a_4 + (a_5 + (a_6 + a_7 x) x) x) \right|$$

in the given range for x using a tool such as Maple. The minimum is 0 for x=0, thus the input condition is respected.

Concerning the second use of the Fast2Sum sequence, we observe as follows:

$$|z_{28}| \approx |z_{26}^h + z_{21}^h|$$
$$|z_{32}| \approx |z_{26}^l + z_{21}^l + (z_{26}^h + z_{21}^h) \cdot 2^{-64}| < |(z_{26}^h + z_{21}^h) \cdot 2^{-63}|$$

so the input condition is verfied also for this sequence.

Let us now estimate the error due to the other two instructions of step 7.

We have exactly  $z_{28} + z_{30} = z_{26}^h + z_{21}^h$  and thus

$$z_{28} + z_{32} = z_{28} + \left(z_{26}^l + \left(z_{21}^l + z_{30}\right)(1 + \epsilon_1)\right)(1 + \epsilon_2)$$

$$= \dots$$

$$= \left(\left(z_{26}^h + z_{26}^l\right) + \left(z_{21}^h + z_{21}^l\right)\right) + \Delta_7$$

where  $\Delta_7$  is

$$\Delta_7 = z_{21}^l \epsilon_1 + z_{30} \epsilon_1 + z_{26}^l \epsilon_2 + z_{21}^l \epsilon_2 + z_{30} \epsilon_2 + z_{21}^l \epsilon_1 \epsilon_2 + z_{30} \epsilon_1 \epsilon_2$$

with  $|\epsilon_1| < 2^{-64}$  and  $|\epsilon_2| < 2^{-64}$  So we can give some estimates for the different terms of the sum which we have commonly calculated using a numerical tool:

$$|z_{21}^l \epsilon_1| < 2^{-177}$$

$$|z_{30}\epsilon_1| < 2^{-160}$$

$$\begin{aligned} |z_{26}^l \epsilon_2| &< 2^{-160} \\ |z_{21}^l \epsilon_2| &< 2^{-177} \\ |z_{30} \epsilon_2| &< 2^{-160} \\ |z_{21}^l \epsilon_1 \epsilon_2| &< 2^{-241} \\ |z_{30} \epsilon_1 \epsilon_2| &< 2^{-224} \end{aligned}$$

Therefore we have

$$|\Delta_7| < 2^{-158}$$

**Lemma 2.17** The sequence labelled "step 8" of the algorithm given above calculates two double extended numbers  $p^h$  and  $p^l$  so that

$$p^h + p^l = ((z_{33}^h + z_{33}^l) + x) + \Delta_8$$

holds with  $|\Delta_8| < 2^{-142}$  and that  $p^h$  is the double extended number nearest to the exact result.

**Proof** Also in this sequence, we see that the first three and the last three instructions of the step consist in the *Fast2Sum* algorithm. We will thus show that the input conditions are respected:

We have to show first that  $|x| > |z_{33}^h|$  is true.

$$|z_{33}^h| \approx \left| \frac{1}{2}x^2 + x^3 \cdot (a_4 + (a_5 + (a_6 + a_7x)x)x) \right|$$

Since

$$x \in \left[ -\frac{\ln 2}{2^{14}}; \frac{\ln 2}{2^{14}} \right] \subset ]-1; 1[$$

this condition is verified.

Concerning the second use of the Fast2Sum sequence, we have to show that  $|z_{35}| > |z_{38}|$ . We have

$$|z_{35}| \approx |z_{33}^h + x|$$

$$|z_{38}| \approx |z_{33}^l + (z_{33}^h + x) \cdot 2^{-64}| < |z_{33}^h \cdot 2^{-63}| + |x \cdot 2^{-64}|$$

Thus the input condition is respected.

Let us now estimate the error induced by the other instruction.

We have  $z_{35} + z_{37} = z_{33}^h + x$  exactly.

Therefore

$$z_{35} + z_{38} = z_{35} + (z_{33}^l + z_{37}) (1 + \epsilon_1)$$

$$= \dots$$

$$= ((z_{33}^h + z_{33}^l) + x) + \Delta_8$$

where  $\Delta_8$  is  $\Delta_8 < z_{33}^l \epsilon_1 + z_{37} \epsilon_1$  with  $\epsilon_1 < 2^{-64}$ . We can check easily using a numerical tool, that

$$|z_{33}^l \epsilon_1| < 2^{-160}$$

$$|z_{37}\epsilon_1| < 2^{-143}$$

Thus 
$$|\Delta_8| < 2^{-142}$$
.

We know now the different errors  $\Delta_i$ , i = 1...8 due to the serveral steps of the algorithm that calculates the polynomial approximation of reduced argument of the exp function. Using this facts, we can now give a proof for the accuracy theorem given above.

In this proof, we will sum up the different error, weighted differently. To simplify it a little bit and to increase its readablity, we will use the following conventions, notations and assumptions:

- A sum of two double extended precision numbers that represent in some way the higher and the lower part of a higher precision number, will be noted  $c^{h/l}$  instead of  $(c^h + c^l)$ .
- We will also make a light abuse of the operation signs + and  $\cdot$ . They will be used either on double extended precision numbers either on sum of two double extended precision numbers noted  $c^{h/l}$ ; e.g.  $c_1^{h/l} \cdot c_2^{h/l}$  will represent  $(c_1^h + c_1^l) \cdot (c_2^h + c_2^l)$ .
- We will note  $\delta_1$ ,  $\delta_2$ ,  $\delta_3$  and  $\delta_4$  the errors made when we represent the constants  $a^{h/l}$ ,  $a_5$ ,  $a_6$  and  $a_7$  in double extended precision. We know that:

$$|\delta_1| < 2^{-128}$$

$$|\delta_2| < 2^{-64}$$

$$|\delta_3| < 2^{-64}$$

$$|\delta_4| < 2^{-64}$$

**Proof** Using the assumptions and lemmata shown above, we get following equation:

$$\begin{split} p^{h/l} &= x + z_{33}^{h/l} + \Delta_8 \\ &= x + z_{26}^{h/l} + z_{21}^{h/l} + \Delta_7 + \Delta_8 \\ &= x + h \cdot z_{11}^{h/l} + z_{15}^{h/l} \cdot z_9^{h/l} + \Delta_5 + \Delta_6 + \Delta_7 + \Delta_8 \\ &= x + h \cdot (x^2 + \Delta_3) + \left(z_{11}^{h/l} \cdot x + \Delta_4\right) \cdot \left(\left(a_4^{h/l} + \delta_1\right) + z_3^{h/l} + \Delta_2\right) + \\ &\quad + \Delta_5 + \Delta_6 + \Delta_7 + \Delta_8 \\ &= \dots \\ &= x + h \cdot x^2 + \left(x^3 + \Delta_3 x + \Delta_5\right) \left(a_4^{h/l} + \delta_1 + \left((a_5 + \delta_2) + \left((a_6 + \delta_3) + (a_7 + \delta_4) \cdot x\right) \cdot x\right) \cdot x + \Delta_1 + \Delta_2\right) \\ &\quad + \Delta_5 + h \cdot \Delta_3 + \Delta_6 + \Delta_7 + \Delta_8 \end{split}$$

At this point, we will simplify a little bit the calculations using some approximations. First, since  $|\Delta_3| = 0$  we get

$$p^{h/l} = x + h \cdot x^{2} + + (x^{3} + \Delta_{4}) \cdot \cdot (a_{4}^{h/l} + \delta_{1} + (a_{5} + \delta_{2} + (a_{6} + \delta_{3} + (a_{7} + \delta_{4}) x) x) x + \Delta_{1} + \Delta_{2}) + + \Delta_{5} + \Delta_{6} + \Delta_{7} + \Delta_{8}$$

Secondly, we can give an approximation of the final error  $\Delta_9$  due to the errors  $\delta_1$ ,  $\delta_2$ ,  $\delta_3$  and  $\delta_4$ . As  $|x^3| < 2^{-46}$ ,  $|x^4| < 2^{-62}$ ,  $|x^5| < 2^{-77}$  and  $|x^6| < 2^{-93}$  we will get in a rather pessimistic approximation

$$|\Delta_9| = |f(\delta_1, \delta_2, \ldots)| < 2^{-46} \cdot 2^{-128} + 2^{-62} \cdot 2^{-64} + 2^{-77} \cdot 2^{-64} + 2^{-93} \cdot 2^{-64} + \hat{\delta}$$

where  $|\hat{\delta}| < 2^{-128}$ .

Thus

$$|\Delta_9| < 2^{-125}$$

Using this observations, we obtain

$$p^{h/l} = x + h \cdot x^{2} + x^{3} \cdot \left(a_{4}^{h/l} + (a_{5} + (a_{6} + a_{7}x)x)x\right) +$$

$$+ x^{3}\Delta_{1} + x^{3}\Delta_{2} + \Delta_{4}\Delta_{1} + \Delta_{4}\Delta_{2} + \Delta_{5} + \Delta_{6} + \Delta_{7} + \Delta_{8} + \Delta_{9}$$

$$= x + h \cdot x^{2} + x^{3} \cdot \left(a_{4}^{h/l} + (a_{5} + (a_{6} + a_{7}x)x)x\right) + \Delta$$

where  $\Delta$  is

$$\Delta = x^{3} \Delta_{1} + x^{3} \Delta_{2} + \Delta_{4} \Delta_{1} + \Delta_{4} \Delta_{2} + \Delta_{5} + \Delta_{6} + \Delta_{7} + \Delta_{8} + \Delta_{9}$$

So, by summing up the different values, one gets:

$$|\Delta| < 2^{-124}$$

We must now prove the additional property pronounced in the theorem which says that for  $x \in [-2^{-30}; 2^{-30}]$  we have

$$|\Delta| < 2^{-141}$$

For doing this we will only reconsider the error  $\Delta_9$  and the last estimate step which will give us a sufficient bound. We had that

$$\Delta = x^3 \Delta_1 + x^3 \Delta_2 + \Delta_4 \Delta_1 + \Delta_4 \Delta_2 + \Delta_5 + \Delta_6 + \Delta_7 + \Delta_8 + \Delta_9$$

and for the given particular domain of x we have

 $|x^3| < 2^{-90}, |x^4| < 2^{-120}, |x^5| < 2^{-150} \text{ and } |x^6| < 2^{-180}.$ 

Thus

$$|\Delta_9| < 2^{-180}$$

and we get the following final summing up

$$\begin{array}{lll} |\Delta| & < & 2^{-90} \cdot 2^{-82} + 2^{-90} \cdot 2^{-130} + 2^{-173} \cdot 2^{-82} + \\ & + & 2^{-173} + 2^{-159} + 2^{-158} + 2^{-142} + 2^{-180} \\ & < & 2^{-141} \end{array}$$

**Theorem 2.18** Let be  $i_1 \in \{0,...,127\}$  and  $i_2 \in \{0,...,127\}$ . Let us assume that we dispose of two tables in which approximations to the exact values  $2^{\frac{i_1}{2^7}}$  respectively  $2^{\frac{i_1}{2^{14}}}$  are stored. Let us assume that each entry consists in 2 double extended numbers  $t_1^h$  and  $t_1^l$  (respectively  $t_2^h$  and  $t_2^l$ ) that satisfy the following conditions:

- ullet  $t^h_j$  is the double extended precision number nearest to  $2^{rac{i_j}{2(j\cdot7)}}$
- $|t_i^l| < |t_i^h| \cdot 2^{-64}$
- $t_i^h + t_i^l = 2^{\frac{i_j}{2(j\cdot7)}} + \delta_j \text{ with } |\delta_j| < 2^{-128}$

So the following instruction sequence calculates two double extended precision numbers  $t^h$  and  $t^l$  so that

$$t^h + t^l = 2^{\frac{i_1}{2^7}} \cdot 2^{\frac{i_1}{2^{14}}} + \Delta$$

where  $|\Delta| < 2^{-123}$  and that  $t^h$  is the double extended number nearest to the correct result. Instruction sequence:

$$\begin{array}{llll} & \text{fma.s1 u\_1 = t\_1\_h, t\_2\_h, f0} \\ & \text{fms.s1 u\_2 = t\_1\_h, t\_2\_h, u\_1} & u_1 + u_2 \leftarrow \textit{Fast2Mult}\left(t_1^h, t_2^h\right) \\ & \text{fma.s1 u\_3 = t\_1\_h, t\_2\_1, u\_2} & u_3 \leftarrow \left\langle t_1^h \cdot t_2^l + u_2 \right\rangle \\ & \text{fma.s1 u\_4 = t\_1\_1, t\_2\_h, u\_3} & u_4 \leftarrow \left\langle t_1^l \cdot t_2^h + u_3 \right\rangle \\ & \text{fadd.s1 t\_h = u\_1, u\_4} \\ & \text{fsub.s1 u\_5 = t\_h, u\_1} \\ & \text{fsub.s1 t\_1 = u\_4, u\_5} & t^h + t^l \leftarrow \textit{Fast2Sum}(u_1, u_4) \\ \end{array}$$

**Proof** We observe that the first two steps of the instruction sequence given consist in the Fast2Mult algorithm and that the last three constitute the Fast2Sum sequence. Let us thus show first that the input condition of the Fast2Sum algorithm is respected:

$$|u_1| \approx |t_1^h \cdot t_2^h|$$

$$\begin{array}{lll} |u_4| & \approx & |t_1^l \cdot t_2^h + t_1^h \cdot t_2^l + t_1^h \cdot t_2^h \cdot 2^{-64}| \\ & < & |t_1^l \cdot t_2^h| + |t_1^h \cdot t_2^l| + |t_1^h \cdot t_2^h \cdot 2^{-64}| \\ & < & \dots \\ & < & |t_1^h \cdot t_2^h| \cdot 2^{-63} < |t_1^h \cdot t_2^h| \end{array}$$

So the input condition is respected.

Therefore, it suffices to estimate the error of  $u_1 + u_4$ .

We know that  $u_1 + u_2 = t_1^h \cdot t_2^h$  correctly.

So we get:

$$u_1 + u_4 = u_1 + (t_1^l \cdot t_2^h + (t_1^h \cdot t_2^l + u_2) (1 + \epsilon_1)) (1 + \epsilon_2)$$
  
= ...  
=  $(t_1^h + t_1^l) \cdot (t_2^h + t_2^l) + \Delta_1$ 

where  $\Delta_1$  is

$$\Delta_1 = t_1^h t_2^l \epsilon_1 + u_2 \epsilon_1 + t_1^l t_2^h \epsilon_2 + t_1^h t_2^l \epsilon_2 + u_2 \epsilon_2 + t_1^h t_2^l \epsilon_1 \epsilon_2 + u_2 \epsilon_1 \epsilon_2 - t_1^l t_2^l$$

with  $|\epsilon_1| < 2^{-64}$  and  $|\epsilon_2| < 2^{-64}$ . As one can easily check, we have:

$$\begin{split} |t_1^h t_2^l \epsilon_1| &< 2^{-127} \\ |u_2 \epsilon_1| &< 2^{-127} \\ |t_1^l t_2^h \epsilon_2| &< 2^{-127} \\ |t_1^h t_2^l \epsilon_2| &< 2^{-127} \\ |u_2 \epsilon_2| &< 2^{-127} \\ |t_1^h t_2^l \epsilon_1 \epsilon_2| &< 2^{-191} \\ |u_2 \epsilon_1 \epsilon_2| &< 2^{-191} \\ |t_1^l t_2^l| &< 2^{-127} \end{split}$$

Thus  $|\Delta_1| < 2^{-124}$ .

To this error, we must add the error due to the rounding of the stored values which can be approximated as follows:

$$\begin{array}{rcl} 2^{\frac{i_1}{2^7}} \cdot 2^{\frac{i_1}{2^{14}}} + \Delta_2 & = & \left(2^{\frac{i_1}{2^7}} + \delta_1\right) \cdot \left(2^{\frac{i_1}{2^{14}}} + \delta_2\right) \\ & = & 2^{\frac{i_1}{2^7}} \cdot 2^{\frac{i_1}{2^{14}}} + \\ & + & 2^{\frac{i_1}{2^7}} \cdot \delta_2 + 2^{\frac{i_1}{2^{14}}} \cdot \delta_1 + \delta_1 \delta_2 \end{array}$$

We can estimate the different terms as given below:

$$|2^{\frac{i_1}{2^7}} \cdot \delta_2| < 2^{-127}$$

$$|2^{\frac{i_1}{2^{14}}} \cdot \delta_1| < 2^{-127}$$
$$|\delta_1 \delta_2| < 2^{-256}$$

Therefore the error due to the incorrect memorization of the table values can be bound by

$$|\Delta_2| < 2^{-125}$$

and we can deduce the final error  $\Delta$  which is

$$|\Delta| < 2^{-123}$$



**Theorem 2.19** Let  $p^h$  and  $p^l$  be two double extended precision numbers that satisfy the following conditions:

$$p^h + p^l \in \left[-2^{-15}; 2^{-15}\right] \text{ and } p^l \in \left[-2^{-79}; 2^{-79}\right].$$

Let  $t^{\hat{h}}$  and  $t^{l}$  be two double extended numbers that satisfy:

$$t^h + t^l \in [1; 2[ \text{ and } t^l \in [-2^{-63}; 2^{-63}].$$

Let  $x^l$  be a double extended number so that  $x^l \in [-2^{-79}; 2^{-79}]$ .

So the instruction sequence given below calculates two double extended numbers  $s^h$  and  $s^l$  so that

$$s^{h} + s^{l} = (t^{h} + t^{l}) \cdot (1 + (p^{h} + p^{l})) \cdot (1 + x^{l}) + \Delta$$

where  $|\Delta| < 2^{-123}$  and that  $s^h$  is the double extended number nearest to the correct result. Instruction sequence:8

- (*i*)  $fma.s1 v_1_h = x_1, t_h, f0$
- $v_{\scriptscriptstyle 1}^h + v_{\scriptscriptstyle 1}^l \leftarrow \textit{Fast2Mult}\left(x^l, t^h\right)$  $fms.s1 v_1_1 = x_1, t_h,$ (ii)  $v_1_h$
- $v_2 \leftarrow t^l \oplus v_1^l$ (iii)  $fadd.s1 v_2 = t_1, v_1_1$
- (iv)  $fadd.s1 v_3_h = t_h, v_1_h$
- (v) $fsub.s1 v_10 = v_3_h, t_h$
- $v_3^h + v_3^l \leftarrow \textit{Fast2Sum}\left(t^h, v_1^h
  ight)$  $fsub.s1 v_3_1 = v_1_h, v_10$ (vi)
- $v_{15} \leftarrow v_3^l \oplus v_2$ (vii)  $fadd.s1 v_15 = v_3_1, v_2$
- (viii)  $fma.s1 v_4_h = p_h, t_h, f0$
- $v_{\!\scriptscriptstyle A}^h + v_{\!\scriptscriptstyle A}^l \leftarrow \textit{Fast2Mult}\left(p^h, t^h
  ight)$  $fms.s1 v_4_1 = p_h, t_h,$ (ix)
- $v_4_h$  $v_5 \leftarrow \langle x^l \cdot v_4^h + v_4^l \rangle$  $fma.s1 v_5 = x_1, v_4_h,$ (x)
- fma.s1 v\_6 = p\_1, t\_h, v\_5 (xi)
- $v_6 \leftarrow \langle p^l \cdot t^h + v_5 \rangle$  $v_7 \leftarrow \langle t^l \cdot p^h + v_6 \rangle$  $fma.s1 v_7 = t_1, p_h, v_6$ (xii)

<sup>&</sup>lt;sup>8</sup>The roman numbers in the beginning of each line are not part of the algorithm, they will be useful

**Remark:** The error  $\Delta$  given in the last theorem expresses only the error due the calculation of the result value with the given input values. The error due to the errors of the input values is not considered here which it will be in another section.

#### Proof

As usual, this instruction sequences uses the Fast2Sum and the Fast2Mult algorithm. The latter can be seen in lines (i) and (ii) and (viii) and (ix). As proven above it is exact for all input values.

The lines (iv) - (vii), (xiii) - (xv) and (xviii) - (xx) constitute the Fast2Sum sequence. Let us show first that their input conditions are respected.

• Lines (iv) - (vi)

$$|v_1^h| \approx |x^l \cdot t^h| < |t^h| \cdot 2^{-79} < |t^h|$$

so the input condition is respected.

• Lines (xiii) - (xv)

$$\begin{split} |v_3^h| > |t^h| \\ |v_4^h| \approx |p^h \cdot t^h| < |t^h| \cdot 2^{-15} < |t^h| < |v_3^h| \end{split}$$

thus the input condition is respected also here.

• Lines (xviii) - (xx)

$$|v_8^h| > |v_3^h| > |t^h|$$

$$\begin{aligned} |v_{13}| & \approx & |v_9 + v_{15}| \\ & \approx & |v_8^l + v_7 + v_{15}| \\ & < & |v_8^h| \cdot 2^{-64} + |v_7| + |v_{15}| \\ & \approx & |v_3^h + v_4^h| \cdot 2^{-64} + |t^l \cdot p^h + v_6| + |v_3^l + v_2| \end{aligned}$$

$$< |v_3^h| \cdot 2^{-64} + |v_4^h| \cdot 2^{-64} + |t^h \cdot p^h| \cdot 2^{-64} + |v_6| + |v_3^h| \cdot 2^{-64} + |v_2|$$

$$\approx \dots$$

$$< |t^h| \cdot 2^{-62} < |t^h| < |v_8^h|$$

For this reason the input condition is respected.

So we can assume the following mathematically exact results:

$$\bullet \ v_1^h + v_1^l = x^l \cdot t^h$$

• 
$$v_3^h + v_3^l = t^h + v_1^h$$

• 
$$v_A^h + v_A^l = p^h \cdot t^h$$

• 
$$v_8^h + v_8^l = v_3^h + v_4^h$$

• 
$$s^h + s^l = v_8^h + v_{13}$$

Therefore we can do the following estimates:

$$s^{h} + s^{l} = v_{8}^{h} + v_{13}$$

$$= v_{8}^{h} + (v_{9} + v_{15}) \cdot (1 + \epsilon_{1})$$

$$= v_{8}^{h} + ((v_{8}^{l} + v_{7}) \cdot (1 + \epsilon_{2}) + (v_{3}^{l} + v_{2}) \cdot (1 + \epsilon_{3})) (1 + \epsilon_{1})$$

$$= \dots$$

$$= v_{8}^{h} + v_{8}^{l} + v_{7} + v_{2} + v_{3}^{l} + \Delta_{1}$$

with

$$\Delta_{1} = v_{8}^{l} \epsilon + v_{7} \epsilon_{2} + v_{3}^{l} \epsilon_{3} + v_{2} \epsilon_{3} + v_{8}^{l} \epsilon_{1} + v_{7} \epsilon_{1} + v_{8}^{l} \epsilon_{1} \epsilon_{2} + v_{7} \epsilon_{1} \epsilon_{2} + v_{3}^{l} \epsilon_{1} + v_{2} \epsilon_{1} \epsilon_{3} + v_{2} \epsilon_{1} \epsilon_{3} + v_{2} \epsilon_{1} \epsilon_{3}$$

Thus

$$\begin{split} s^h + s^l &= v_3^h + v_4^h + v_7 + v_2 + v_3^l + \Delta_1 \\ &= t^h + v_1^h + v_4^h + v_7 + v_2 + \Delta_1 \\ &= t^h + v_1^h + v_4^h + v_7 + \left(t^l + v_1^l\right) \left(1 + \epsilon_4\right) + \Delta_1 \\ &= \dots \\ &= t^h + t^l + x^l + t^h + v_4^h + v_7 + \Delta_2 \end{split}$$

with

$$\Delta_2 = t^l \epsilon_4 + v_1^l \epsilon_4 + \Delta_1$$

Therefore

$$s^{h} + s^{l} = t^{h} + t^{l} + x^{l}t^{h} + v_{4}^{h} + (t^{l}p^{h} + v_{6}) \cdot (1 + \epsilon_{5}) + \Delta_{2}$$

$$= \dots$$

$$= t^{h} + t^{l} + x^{l}t^{h} + v_{4}^{h} + t^{l}p^{h} + t^{h}p^{l} + v_{5} + \Delta_{3}$$

with

$$\Delta_3 = p^l t^h \epsilon_6 + v_5 \epsilon_6 + t^l p^h \epsilon_5 + p^l t^h \epsilon_5 + v_5 \epsilon_5 + p^l t^h \epsilon_5 \epsilon_6 + v_5 \epsilon_5 \epsilon_6 + \Delta_2$$

Thus

$$s^{h} + s^{l} = t^{h} + t^{l} + x^{l}t^{h} + v_{4}^{h} + t^{l}p^{h} + t^{h}p^{l} + (x^{l}v_{4}^{h} + v_{4}^{l}) \cdot (1 + \epsilon_{7}) + \Delta_{3}$$

$$= \dots$$

$$= t^{h} + t^{l} + x^{l}t^{h} + t^{h}p^{h} + t^{l}p^{h} + t^{h}p^{l} + x^{l}v_{4}^{h} + \Delta_{4}$$

with

$$\Delta_4 = x^l v_4^h \epsilon_7 + v_4^l \epsilon_7 + \Delta_3$$

So we have

$$s^{h} + s^{l} = t^{h} + t^{l} + x^{l}t^{h} + t^{h}p^{h} + t^{l}p^{h} + t^{h}p^{l} + x^{l}p^{h}t^{h} (1 + \epsilon_{8}) + \Delta_{4}$$

$$= \dots$$

$$= t^{h} + t^{l} + x^{l}t^{h} + t^{h}p^{h} + t^{l}p^{h} + t^{h}p^{l} + x^{l}p^{h}t^{h} + \Delta_{5}$$

with

$$\Delta_5 = x^l p^h t^h \epsilon_8 + \Delta_4$$

So finally,

$$s^{h} + s^{l} = t^{h} + t^{l} + x^{l}t^{h} + t^{h}p^{h} + t^{l}p^{h} + t^{h}p^{l} + x^{l}p^{h}t^{h} + x^{l}p^{l}t^{h} + x^{l}t^{l} + t^{l}p^{l} + t^{l}x^{l}p^{h} + t^{l}x^{l}p^{l} - x^{l}p^{l}t^{h} - x^{l}t^{l} - t^{l}p^{l} - t^{l}x^{l}p^{h} - t^{l}x^{l}p^{l} + \Delta_{5}$$

$$= (t^{h} + t^{l})(1 + (p^{h} + p^{l})) \cdot (1 + x^{l}) + \Delta$$

with

$$\Delta = -x^l p^l t^h - x^l t^l - t^l p^l - t^l x^l p^h - t^l x^l p^l + \Delta_5$$

In all this estimates, the  $\epsilon_i$  are  $|\epsilon_i| < 2^{-64}$ . And we can deduce the final error estimate:

$$\begin{split} |\Delta| &< |x^l p^l t^h| + |x^l t^l| + |t^l p^l| + |t^l x^l p^h| + \\ &+ |t^l x^l p^l| + |x^l p^h t^h \epsilon_8| + |x^l v_4^h \epsilon_7| + |v_4^l \epsilon_7| + \\ &+ |p^l t^h \epsilon_6| + |v_5 \epsilon_6| + |t^l p^h \epsilon_5| + |p^l t^h \epsilon_5| + \\ &+ |v_5 \epsilon_5| + |p^l t^h \epsilon_5 \epsilon_6| + |v_5 \epsilon_5 \epsilon_6| + |t^l \epsilon_4| + \\ &+ |v_1^l \epsilon_4| + |v_8^l \epsilon_2| + |v_7 \epsilon_2| + |v_3^l \epsilon_3| + \\ &+ |v_2 \epsilon_3| + |v_8^l \epsilon_1| + |v_7 \epsilon_1| + |v_8^l \epsilon_1 \epsilon_2| + \\ &+ |v_7 \epsilon_1 \epsilon_2| + |v_3^l \epsilon_1| + |v_2 \epsilon_1| + |v_3^l \epsilon_1 \epsilon_3| + \\ &+ |v_2 \epsilon_1 \epsilon_3| \end{split}$$

By approximating all these different values as it has been shown in a similar way in the previous sections, one gets the following final result:

$$\begin{split} |\Delta| &< 2^{-157} + 2^{-142} + 2^{-142} + 2^{-157} + 2^{-221} + 2^{-157} + 2^{-157} + \\ &+ 2^{-142} + 2^{-142} + 2^{-141} + 2^{-142} + + 2^{-142} + 2^{-206} + 2^{-127} + 2^{-206} + \\ &+ 2^{-126} + 2^{-140} + 2^{-126} + 2^{-126} + 2^{-126} + 2^{-140} + 2^{-190} + \\ &+ 2^{-204} + 2^{-126} + 2^{-126} + 2^{-190} + 2^{-190} \\ &= 6 \cdot 2^{-126} + 2^{-127} + \ldots < 2^{-123} \end{split}$$

**Lemma 2.20** Let  $s^h$  and  $s^l$  be two double extended precision numbers so that  $s^h + s^l \in [0..2[$  and that  $s^l \in [-2^{-64}; 2^{-64}]$ .

Let f2M be a double extended precision number that represents a value  $2^M$ ,  $M \in \mathbb{N}$ . So the following instruction sequence calculates  $2^M \cdot (s^h + s^l)$  correctly and rounds this result to a double precision number res without any intermediate error as long as the final result does not underflow. The rounding is effectuated according to the user rounding mode set. Instruction sequence:

fma.s1 s\_1\_2M = s\_1, f2M, f0 
$$s^l_{2^M} \leftarrow s^l \otimes f2M$$
 fma.d.s0 res = s\_h, f2M, s\_1\_2M 
$$res \leftarrow \left\langle s^h \cdot f2M + s^l_{2^M} \right\rangle_{53}$$

**Remark:** The IEEE standard [5] applied on the calculation of a transcendental function such as exp require the correct setting of the "inexact" flag when underflow occurs and taking of a trap for exception handling. As the exponential function is monotonic increasing the underflow of the final result can simply be excluded from the main path of the algorithm by a preceding tests on the argument of the function. So one has to think only of the underflow of intermediate results such as  $s_{2M}^l$  in the following proof.

**Proof** If neither the final nor the intermediate value  $s_{2^M}^l$  underflow, the multiplication with a power of 2 is exact. So one can trivially see that all the properties are verified.

We have assumed that the final result does not underflow so we have only to consider the case in which the intermediate result  $s_{2^M}^l$  underflows while the final result does not. In this case, we observe:

$$|res| \approx |s^h \cdot 2^M + s^l_{2^M}| > 2^{-1022}$$

because the final result does not underflow and

$$|s_{2^M}^l| \approx |s^l \cdot 2^M| < |s^h \cdot 2^M| \cdot 2^{-64}$$

So we can do the following approximation

$$|s^h \cdot 2^M| 2^{-1021}$$

and as we know that the value  $s_{2M}^l$  which is stored in register format with a 17 bit exponent underflows, we have

$$|s_{2^M}^l| < 2^{2^{17-1}-2} = 2^{65534}$$

So the value  $s_{2^M}^l$  is so small in comparision to  $s^h \cdot 2^M$  that, even when we loose all significant bits in  $s_{2^M}^l$  this will not affect the final result.

If the final result underflows the sequence is still correct, since the intermediate calculations during the last fma.d.s0 instruction are done in infinite precision before rounding and the temporary value  $s_{2^M}^l$  result, stored in double extended register format, does not necessarily underflow when the final result does and if it does a similar argument to the preceding one can be used. In contrast to the main path, a trap to an exception handler must be taken.

**Theorem 2.21** Let an algorithm consist in all the steps given above (cf. 2.8, 2.9, 2.18, 2.19 and 2.20), which are the range reduction step, the table entry multiplication step, the polynomial approximation, the reconstruction and the final rounding step, and in some supplementary instructions which can be found in the complete listing (cf. 7) and whose correctness can be trivially proven.

So this algorithm calculates an approximation  $\hat{y}$  to the exponential function  $e^x$  so that at least significant 116 bit of  $\hat{y}$  are correct and rounds this approximation to a double precision number according to the rounding mode set.

**Proof** As we just have proven that the final multiplication by  $2^M$  can be done without any error and as we know all the errors of the different steps, it suffices to sum a the weighted sum of all these errors. We can postulate

$$s^{h/l} = \frac{e^x}{2^M} + \Delta$$

where  $\Delta$  is

$$|\Delta| < |\Delta_{\mathbf{reduc}}| + |\Delta_{\mathbf{approx}}| + |\Delta_{\mathbf{arith}}|$$

where  $\Delta_{\mathbf{reduc}}$  is the error due to range reduction,  $\Delta_{\mathbf{approx}}$  is the error induced by approximating the exponential function by a polynomial and  $\Delta_{\mathbf{arith}}$  is the error produced by the floating point arithmetic. Let us remind the complete term showing how the value  $s^{h/l}$  is evaluated:

$$s^{h/l} = t^{h/l} \cdot \left(1 + p^{h/l} \left(r\right)\right) \cdot \left(1 + x^{l}\right) + \Delta.$$

As  $t^{h/l} \in [0..2[$  and by using theorem 2.8 we obtain

$$|\Delta_{\mathbf{reduc}}| < 2 \cdot 2^{-118} = 2^{-117}$$

and similarly using theorem 2.6 we get

$$|\Delta_{\mathbf{approx}}| < 2 \cdot 2^{-123} = 2^{-122}$$

Further we can write:

$$|\Delta_{\mathbf{arith}}| < |\Delta_{\mathbf{reconst}}| + |\Delta_{\mathbf{table}}| + 2 \cdot |\Delta_{\mathbf{poly}}|$$

Using the theorems 2.19, 2.18 and 2.9 one gets

$$|\Delta_{\mathbf{poly}}| < 2^{-123} + 2^{-123} + 2 \cdot 2^{-123} < 2^{-121}$$

So the final overall error is

$$|\Delta| < 2^{-117} + 2^{-122} + 2^{-121} < 2^{-116}$$

and the property follows trivially using lemma 2.20.

#### Theorem 2.22 (Lefèvre) [23, 10]

Let y be the exponential function value of a double precision floating point value x. Let  $y^*$  be an approximation to y so that the distance between the mantissas of y and  $y^*$  can be majored by  $\epsilon$ . So

- for  $|x| \ge 2^{-30}$ , if  $\epsilon < 2^{-53-59} = 2^{-112}$ , for all rounding modes, rounding  $y^*$  to double precision is equivalent to rounding y.
- for  $|x| < 2^{-30}$ , if  $\epsilon < 2^{-53-104} = 2^{-157}$ , rounding  $y^*$  is equivalent to rounding y.

**Proof** see [10]

**Corollary 2.23** The algorithm given calculates a double precision number y which is a correctly rounded approximation to  $e^x$  for all double precision input values which satisfy the predicate  $|x| < 2^{-53} \lor |x| > 2^{30}$ .

**Proof** We have proven above that the algorithm given calculates a 112 bit correct approximation of the exponential function for all inputs and that it rounds this result to double precision, the property to be shown follows trivially using Lefèvre's theorem.

#### 2.3 Towards a correctly rounded algorithm for all arguments

With the last corollary (cf. 2.23) we have proven that the algorithm we present in this article calculates a correctly rounded approximation to the exponential function unless the function's argument is not contained in a very small range of inputs, i.e. it is correct for all  $x \notin [-2^{-30}; -2^{-53}] \cup [2^{-53}; 2^{-30}]$ . In this section, we will show that the algorithm calculates a 157 bits correct result for input values  $x \in [-2^{-30}; 2^{-53}] \cup [2^{-53}; 2^{-30}]$ . For this we will use the supplementary results of some lemmata above that we have not used yet.

At first sight, one could argue that the algoritm simply cannot return a 157 bit correct result as all intermediate values are stored in two double extended precision registers with each 64 bits of mantissa. But one has to remember that this high precision is needed only

when the table maker's dilemma occurs. In the other cases less precision is sufficient. In fact if one considers more closely the contents of e.g. the two registers  $s^h$  and  $s^l$  which contain the result of the function before the final multiplication by  $2^M$  and before rounding, one observes the following situation on an input argument on which the table maker's dilemma occurs e.g. in round to  $+\infty$  mode<sup>9</sup>: the infinite precision mantissa of the result which must be approximated and stored in  $s^h$  and  $s^l$  is e.g. of the following form (cf. [2]):

$$2^{k} \cdot \underbrace{\frac{m \text{ bits}}{1.x_{1}x_{2}x_{3}x_{4}x_{5} \dots x_{n-1}0}}_{53 \text{ bits}} 111111 \dots 111111}_{m y_{1}y_{2}y_{3}y_{4} \dots}$$

where m is the table maker's dilemma's precision number and k the floating point format exponent.

Let us assume that the previous steps of the algorithm provide a sufficient precision, so this value is stored in  $s^h$  and  $s^l$  as follows:

where  $\bar{y}_i$  stands for the negated value of  $y_i$  which is  $1 - y_i$ . So as one can see, the long series of ones<sup>10</sup> which constitute the difficulty in the table maker's dilemma's special cases are stored in  $s^h$  and  $s^l$  only implicitly. This positive effect is actually the greater the more difficult the case is.

We will prove in the following that the given algorithm calculates  $s^h$  and  $s^l$  so that this 'phenomenon' can be observed and that actually at least 157 bits of the mantissa represented in this form with a implicit storing of a long suite of ones or zeros are significant. For this, we will show that for the input values in  $\left[-2^{-30};2^{-53}\right]\cup\left[2^{-53};2^{-30}\right]$  on which the table maker's dilemma occurs some parts of the algorithm only deal with exact values without any intermediate rounding.

As we have already seen in lemma 2.8, in the given particular range, we can assume that k = 0, so  $i_1 = 0$  and  $i_2 = 0$  and that r = x and finally  $x^l = 0$ .

We know that  $2^{\frac{0}{2^7}} = 1$  and  $2^{\frac{0}{2^{14}}} = 1$ , so the respective table entries will be  $t_1^h = 1$ ,  $t_1^l = 0$ ,  $t_2^h = 1$  and  $t_2^l = 0$ . As multiplications by 1 and additions with 0 can be done without any arithmetical error, one can easily see, considering the instruction sequence given in 2.18 that  $t^h = 1$  and  $t^l = 0$  exactly.

So we can observe in the final reconstruction sequence given in lemma 2.19 that we get the following exact results:

$$v_1^h = 0, v_1^l = 0$$
  
 $v_2 = 0$ 

<sup>&</sup>lt;sup>9</sup>The other rounding modes present similar situation or are 'easier' in terms of the maximum accuracy needed.

<sup>&</sup>lt;sup>10</sup>or zeros in other cases

$$v_{3}^{h} = 1, v_{3}^{l} = 0$$

$$v_{15} = 0$$

$$v_{4}^{h} = p^{h}, v_{4}^{l} = 0$$

$$v_{5} = 0$$

$$v_{6} = p^{l}$$

$$v_{7} = p^{l}$$

$$v_{8}^{h} + v_{8}^{l} = 1 + p^{h}$$

Let us now consider more precisely the contents of registers  $v_8^h$  and  $v_8^l$ . In particular we want to prove that

$$v_8^l = 0$$

As one can easily proof, for  $2^{-53} < |x| < 2^{-30}$  we have  $2^{-53} < |p^h + p^l| < 2^{-29}$  and we know that we are in a case where the table maker's dilemma occurs with more than 64 bits of critical accuracy. Assuming in a first step that  $p^h + p^l$  provide enough accuracy, we observe the following situation<sup>11</sup>; the equation is meant to be read as a mathematical one:

$$1+p^h+p^l=1.\underbrace{0\ldots\ldots0}_{\geq 29 \text{ bits}}\underbrace{\underbrace{1x_1x_2\ldots x_j0_{{}^{53}\mathrm{rd}}}_{\leq 24 \text{ bits}} 1\ldots 1_{{}^{64}\mathrm{th}} \underbrace{1\ldots1}_{\geq 29 \text{ bits}} \underbrace{1\ldots10y_1y_2\ldots}_{\geq 29 \text{ bits}}$$

So  $p^h$  and  $p^l$  will actually contain the following values:

$$p^h = 1.x_1x_2...x_j10...0$$
$$p^l = -1.\bar{y_1}\bar{y_2}...$$

It is imporant to see that  $p^h$  will contain at least 29 trailing zeros. So one can observe for the intermediate result  $v_8^h + v_8^l$ :

$$v_8^h + v_8^l = 1 + p^h = \overbrace{1.0 \dots 01x_1x_2 \dots x_j 10 \dots 0_{\text{\tiny 64th}}}^{\text{in } v_8^l} \underbrace{0 \dots 0\dots}_{\text{\tiny 64th}}$$

Thus we know that  $v_8^h = 1 + p^h$  is a exact result and that  $v_8^l = 0$ . Therefore as additions with 0 are errorfree, we have the exact results

$$v_9 = p^l$$

<sup>&</sup>lt;sup>11</sup>in round-to-nearest mode; the other modes are similar

and

$$v_{13} = p^l$$

So  $v_8^h + v_{13}$  contains without any rounding error  $1 + p^h + p^l$ . As the Fast2Sum sequence leading to  $s^h$  and  $s^l$  is proven to be exact, we know that

$$s^h + s^l = 1 + p^h + p^l$$

exactly.

In order to prove that  $s^h + s^l$  represents an approximation to the exponential function with at least 157 bits of accuracy if  $x \in \left[-2^{-30}; 2^{-30}\right]$  and if the table maker's dilemma occurs, it suffices therefore to show that  $p^h + p^l$  is accurate enough. We have proven by theorem 2.9 that the arithmetical error due to the evaluation of the polynomial in the given range is  $|\Delta| < 2^{-141}$  and we have shown in 2.6 that the polynomial used approximates the exponential function with a maximal error of  $|\Delta| < 2^{-161}$ . So we can assume that at least 140 bits<sup>12</sup> of  $p^h + p^l$  are correct. As we know that

$$|p^h + p^l| < 2^{-29}$$

the impact of this error on the final error in  $s^h + s^l$  is scaled by at least  $2^{-29}$ . So at least 140 + 29 = 169 bits of the intermediate result before rounding are exact and we can affirmate

**Corollary 2.24** The algorithm given for the evaluation of the exponential function calculates a double precision number y which is a correctly rounded approximation to  $e^x$  for all double precision input values.

**Proof** This property follows trivially from the results stated above and Lefèvre's theorem announced as theorem 2.22.

## 3 Performance and accuracy testing

The implementation of the exponential function has been checked on two lists obtained using Lefèvre's algorithm [7] containing all worst case values with a critical intermediate precision over 100 bits. The first 2270 entry list contains argument-result pairs for the round-to-nearest rounding mode, the second one contains 4074 entries for the directed rounding modes. The algorithm returned a correct result for all entries of both lists in all corresponding rounding modes. This verification is a useful check that the theoretical proof given above is correct.

In addition the implementation of the exponential function has been tested using the Intel Math Libary Test Suite (IMLTS) which is a test system which is particulary adapted to this purpose. It uses a multiprecision library implementation for checking the correctness

<sup>12</sup> One remarks that as result of the use of the Fast2Sum sequence in the polynomial approximation phase, a similar effect as the one described here can be observed on  $p^h + p^l$ . For this reason, one can assume that a 140 bit precise result can be stored in two double extended numbers.

of the results of the standard mathmatical library functions on randomly produced or hand chosen arguments as a reference.

Performance testing is very important if one wants to provide a function which is not only correctly rounding but also highly optimized in speed. The Itanium processor instruction set supports the explicit use of parallelism in programs which has the consequence that the assembly code must be carefully scheduled for maximum performance. This processus resulted in a about 100 cycles gain between the first un-scheduled version of the code and final one as it can be found in section 7. The scheduling has been highly optimized for the Itanium 2 processor and will therefore provide slightly less excellent performance on Itanium 1 systems.

Concerning the accuracy checking, which includes the check if all flags needed to IEEE [5] compliance are correctly set, the function has been tested on 130000000 randomly chosen arguments in the definition domain of the function  $^{13}$  in each of the 4 rounding modes two of which are actually identical due to the fact that the exponential function is positive on all arguments. Additionnally, the function has been tested on supplementary arguments in the range  $x \in [-2^{-30}; -2^{-53}] \cup [2^{-53}; 2^{-30}]$  which is known to be particulary 'difficult' as one can see in the theorem on the rounding of the exponential function given in [6, 7]. In none of this ranges, the function showed up a rounding error greater than or equal to 0.5ulp respectively 1.0ulp for the directed modes. All flags were correctly set on all arguments including the under-/ overflow cases. This result is a positive experimental verification of the mathematical prove given above.

With respect to performance, the implementation has been compared on the one hand to the implementation given in [6] which has been proven to be correctly rounding. On the other hand, a comparison to the open-source, less accurate ( $\leq 0.502$ ulp), higher optimized library Intel provides [17] for Itanium based systems has been done. The first has been compiled using Intel 's ecl compiler for Itanium systems using some compiler options which are needed for the correctness of this library<sup>14</sup> but which affect the performance of the function. The latter has simply be assembled to a functional library. Unfortunately the portable correct rounding implementation provided by David Defour could only be tested in round to nearest mode since it implements the different IEEE standard rounding modes in different functions whereas the floating point status register for rounding control is not be taken in account which makes it completely incompatible to the timing system used.

The functions have been timed for all paths of the algorithm we presented. In addition, serveral points on which the second evaluation phase [6] is launched in Defour's implementation have been timed.

<sup>&</sup>lt;sup>13</sup>i.e. in the range  $x \in [-800; 800]$ 

<sup>&</sup>lt;sup>14</sup>i.e. the -QIPF\_fma- and the -QIPF\_fltacc- options which prevent the compiler from optimizing expressions such as a \* b + c by means of the fma instruction which does no intermediate rounding.

Range	our crexp	Defour's exp	Intel 's exp
$x = \pm 0$	9	38	10
$ x  < 2^{-53}, x \neq 0$	17	38	42
$-700 < x < 700,  x  > 2^{-53}$	172	255	42
$710 < x < 1000  ext{ (overflow)}$	72	53	255
-745 < x < 709  (underflow)	4578	4807	3158
-1000 < x < -750  (zero)	1576	1934	1814
$x = +\infty$	12	47	11
$x = -\infty$	10	47	9
$x = \mathtt{nan}$	12	46	11
x positive denormal	373	3573	545
x negative denormal	383	3600	524
Hard case 1	172	4707	42
Hard case 2	172	4721	42
Hard case 3	172	3951	42
Hard case 4	172	4218	42

The hard cases mentionned in this list are 4 randomly chosen arguments on which Defour's implementation must launch the second phase to guarantee the correct rounding. A mean value timing on these cases has not been done, also other values may be different timings.

As the scheduling has explicitly be done for the latencies of the newer Intel Itanium 2 processor, the function will show less excellent performance on Itanium 1.

All these results show that the given implementation of a correct rounding exponential is competitive in comparison to implementations that provide a correctly rounded result and can be a good alternative to less accurate one.

### 4 Future work

A critical view on the given algorithm lets one easily discover that the main part of the latency of the algorithm is due to the polynomial evaluation. In fact, assuming the latency of an fma instruction on Intel Itanium 2 to be 4 cycles, analysis of the different steps of this phase gives a latency of at least 100 cycles for the evaluation of the polynomial until  $p^h$  is available. This makes one think that the parallelism the processor is capable of is not fully exploited.

Considerating even more precisely the polynomial and the magnitudes of the different values involved, one sees that in

$$p(x) = x + \frac{1}{2}x^2 + (a_4^h + a_4^l)x^3 + x^4 \cdot (a_5 + x \cdot (a_6 + a_7 x))$$

the higher degree terms  $x^4 \cdot (a_5 + x \cdot (a_6 + a_7 x))$  will only affect the lower part  $p^l$  of the final result. This part of the polynomial can therefore be evaluated in parallel to the other parts

in native precision only. In addition, the intermediate value  $x^4$ , which is needed only with an accuracy of one double extended number, can be calculated as  $x^2 \cdot x^2$  using the high part of the machine representation of  $x^2$  in two double extended numbers. Further some intermediate normalizations, i.e. the use of a Fast2Sum sequence on potentially 'overlapping' numbers  $z^h$  and  $z^l$ , which are done in the algorithm we presented above, could be saved at the cost of a even more complex accuracy proof.

Let us give an instruction sequence for the polynomial evaluation that takes advantage of this deliberations. The sequence can be scheduled for Intel Itanium 2 in such a way that the higher part  $p^h$  of the result is available after only 42 machine cycles; the cycle in which the instructions can be executed are indicated in the beginning of each line. We will consider the accuracy of this sequence below.

```
(1)
             fma z_1 = x, x, f0
                                                             z_1 \leftarrow x \otimes x
(1)
             fma z_2 = a_4_h, x, f0
                                                             z_5 \leftarrow \langle a_7 \cdot x + a_6 \rangle
(2)
             fma z_5 = a_7, x, a_6
                                                             z_{10} \leftarrow a_4^l \otimes x
(2)
             fma z_10 = a_4_1, x, f0
(5)
             fma z_3 = z_2, z_1, f0
             fma z_4 = z_1, z_1, f0
                                                             z_4 \leftarrow z_1 \otimes z_1
(5)
                                                             z_6 \leftarrow \langle z_5 \cdot x + a_5 \rangle
             fma z_6 = z_5, x, a_5
(6)
                                                             z_1 + z_9 \leftarrow \textit{Fast2Mult}(x, x)
             fms z_9 = x, x, z_1
(6)
(7)
             fma z_11 = z_10, z_1, f0
                                                             z_{11} \leftarrow z_{10} \otimes z_1
(7)
             fma z_13 = h, z_1, f0
                                                             z_{13} \leftarrow h \otimes z_1
                                                             z_2 + z_{21} \leftarrow \textit{Fast2Mult}(a_4^h, x)
             fms z_21 = a_4_h, x, z_2
(8)
                                                             z_3 + z_8 \leftarrow \textit{Fast2Mult}(z_1, z_2)
(9)
             fms z_8 = z_2, z_1, z_3
             fma z_7 = z_4, z_6, f0
(10)
                                                             z_7 \leftarrow z_4 \otimes z_6
             fma z_12 = z_2, z_9, f0
                                                             z_{12} \leftarrow z_2 \otimes z_9
(10)
(11)
             fma z_14 = h, z_9, f0
                                                             z_{14} \leftarrow h \otimes z_9
             fadd z_15 = x, z_13
(11)
(12)
             fma z_22 = z_21, z_1, f0
                                                             z_{22} \leftarrow z_{21} \otimes z_1
(13)
             fadd z_23 = z_8, z_{11}
                                                             z_{23} \leftarrow z_8 \oplus z_{11}
             fadd z_24 = z_7, z_{12}
(14)
                                                             z_{24} \leftarrow z_7 \oplus z_{12}
             fadd z_18 = z_15, z_3
(15)
             fsub z_16 = z_15, x
(16)
(16)
             fadd z_25 = z_14, z_22
                                                             z_{25} \leftarrow z_{14} \oplus z_{22}
             fadd z_26 = z_23, z_24
(18)
                                                             z_{26} \leftarrow z_{23} \oplus z_{24}
             fsub z_19 = z_18, z_15
(19)
                                                             z_{15} + z_{17} \leftarrow \textit{Fast2Sum}(x, z_{13})
(20)
             fsub z_17 = z_13, z_16
             fadd z_27 = z_25, z_26
                                                             z_{27} \leftarrow z_{25} \oplus z_{26}
(22)
             fsub z_20 = z_3, z_19
                                                             z_{18} + z_{20} \leftarrow \textit{Fast2Sum}\left(z_{15}, z_{3}\right)
(23)
(26)
             fadd z_28 = z_17, z_27
                                                             z_{28} \leftarrow z_{17} \oplus z_{27}
             fadd z_29 = z_28, z_20
                                                             z_{29} \leftarrow z_{28} \oplus z_{20}
(30)
             fadd p_h = z_18, z_29
(34)
```

$$(38)$$
 fsub z\_30 = p\_h, z\_18

$$(42) \hspace{1cm} \texttt{fsub p\_1 = z\_29, z\_30} \hspace{1cm} p^h + p^l \leftarrow \textit{Fast2Sum} \, (z_{18}, z_{29})$$

Concerning the accuracy of this sequence, let us show now that for  $|x|<\frac{\ln 2}{2^{15}},\ h=\frac{1}{2}$  exactly,  $a_4^h+a_4^l\approx\frac{1}{6},\ a_5\approx\frac{1}{24},\ a_6\approx\frac{1}{120}$  and  $a_7\approx\frac{1}{720}$ , the sequence calculates a result

$$p^h + p^l = p(x) + \Delta$$

with an error  $\Delta$  with  $|\Delta| < 2^{-126}$  and for  $|x| < 2^{-30}$  with only  $|\Delta| < 2^{-155}$ 

**Proof** Similarly to the sequences of the first version of algorithm whose accuracy has been proven above, this instruction sequence makes use of the Fast 2Sum algorithm. Let us show first that the respective input conditions are respected.

The Fast2Sum is used first for calculating

$$z_{15} + z_{17} = Fast2Sum(x, z_{13})$$

We have  $|z_{13}| \approx \frac{1}{2} \cdot x^2$  and |x| < 1 so the input condition is respected. The second use of the *Fast2Sum* sequence is made for calculating

$$z_{18} + z_{20} = \textit{Fast2Sum}\left(z_{15}, z_{3}
ight)$$

We know that

$$|z_{15}| \approx \left| x + \frac{1}{2} \cdot x^2 \right|$$

and

$$|z_3| \approx \left| \frac{1}{6} \cdot x^3 \right|$$

So the input condition is respected also here.

The third time the sequence is used is for the calculation of

$$p^h + p^l = \textit{Fast2Sum}(z_{18}, z_{29})$$

One can verify that for  $2-53 < |x| < 2^{-1515}$  we have

$$|z_{18}| \approx \left| x + \frac{1}{2} \cdot x^2 + \frac{1}{6} \cdot x^3 \right| > 2^{-52}$$

and

$$|z_{29}| < \left| 2^{-61} \cdot \left( \frac{1}{12} + \frac{61}{60} \cdot x + \frac{181}{180} \cdot x^2 + \frac{1}{6} \cdot x^3 \right) \right| < 2^{-64}$$

<sup>15</sup> The lower bound is a result of the fact that for  $|x| < 2^{-53}$  we can simply return  $\langle 1 + x \rangle_{53}$  as a correctly rounded double precision approximation to the exponential function; see [23].

So  $|z_{18}| > |z_{29}|$  and thus, the input condition is respected. Hence we get the exact results

$$z_{1} + z_{9} = x^{2}$$

$$z_{13} = \frac{1}{2} \cdot z_{1}$$

$$z_{14} = \frac{1}{2} \cdot z_{9}$$

$$z_{2} + z_{21} = a_{4}^{h} \cdot x$$

$$z_{3} + z_{8} = z_{2} \cdot z_{1}$$

$$z_{15} + z_{17} = x + z_{13}$$

$$z_{18} + z_{20} = z_{15} + z_{3}$$

$$p^{h} + p^{l} = z_{18} + z_{29}$$

So if one approximates the error for each of the instructions left in a similar way as shown above, one gets

$$p^h + p^l = x + h \cdot x^2 + x^3 \cdot (a_4^h + a_4^l) + a_5 \cdot x^4 + a_6 \cdot x^5 + a_7 \cdot x^6 + \Delta$$

with

$$\Delta = z_1 z_{21} \epsilon_{12} + z_1 z_{10} \epsilon_{13} + z_1 a_4^l x \epsilon_{14} + z_2 z_9 \epsilon_{15} + a_4^h x z_9 \epsilon_{16} - a_4^l x z_9 +$$

$$+ a_7 x^6 \epsilon_{12} + a_6 x^5 \epsilon_{12} + z_5 x^5 \epsilon_{11} + a_5 x^4 \epsilon_{11} + 2 x^4 z_6 \epsilon_{10} + x^4 z_6 \epsilon_{10}^2 +$$

$$+ z_1 z_1 z_6 \epsilon_9 + z_4 z_6 \epsilon_8 + z_7 \epsilon_7 + z_{12} \epsilon_7 + z_8 \epsilon_6 + z_{11} \epsilon_6 + z_{23} \epsilon_5 + z_{24} \epsilon_5 +$$

$$+ z_{14} \epsilon_4 + z_{22} \epsilon_4 + z_{25} \epsilon_3 + z_{26} \epsilon_3 + z_{17} \epsilon_2 + z_{27} \epsilon_2 + z_{28} \epsilon_1 + z_{20} \epsilon_1$$

with  $|\epsilon_i| \leq 2^{-64}$ .

For  $|x| < 2^{-15}$ ,  $|x^2| < 2^{-30}$ ,  $|x^3| < 2^{-45}$ ,  $|x^4| < 2^{-60}$ ,  $|x^5| < 2^{-75}$  and  $|x^6| < 2^{-90}$  we get the results in the left column of the following table, for  $|x| < 2^{-30}$ ,  $|x^2| < 2^{-60}$ ,  $|x^3| < 2^{-90}$ ,  $|x^4| < 2^{-120}$ ,  $|x^5| < 2^{-150}$  and  $|x^6| < 2^{-180}$  the results given in the right column below:

$ z_1 z_{21} \epsilon_{12}  < 2^{-175}$	$ z_1 z_{21} \epsilon_{12}  < 2^{-220}$
$ z_1 z_{10} \epsilon_{13}  < 2^{-175}$	$ z_1 z_{10} \epsilon_{13}  < 2^{-220}$
$\left  z_1 a_4^l x \epsilon_{14} \right  < 2^{-175}$	$\left  z_1 a_4^l x \epsilon_{14} \right  < 2^{-220}$
$ z_2 z_9 \epsilon_{15}  < 2^{-175}$	$ z_2 z_9 \epsilon_{15}  < 2^{-220}$
$\left  a_4^h x z_9 \epsilon_{16} \right  < 2^{-175}$	$\left  a_4^h x z_9 \epsilon_{16} \right  < 2^{-220}$
$\left  a_4^l x z_9 \right  < 2^{-175}$	$\left  a_4^l x z_9 \right  < 2^{-220}$
$\left  a_7 x^6 \epsilon_{12} \right  < 2^{-163}$	$\left  a_7 x^6 \epsilon_{12} \right  < 2^{-253}$
$\left  a_6 x^5 \epsilon_{12} \right  < 2^{-145}$	$\left  a_6 x^5 \epsilon_{12} \right  < 2^{-210}$
$\left  z_5 x^5 \epsilon_{11} \right  < 2^{-145}$	$\left  z_5 x^5 \epsilon_{11} \right  < 2^{-210}$
$\left  a_5 x^4 \epsilon_{11} \right  < 2^{-128}$	$\left  a_5 x^4 \epsilon_{11} \right  < 2^{-188}$
$\left  x^4 z_6 \epsilon_{10} \right  < 2^{-127}$	$\left  x^4 z_6 \epsilon_{10} \right  < 2^{-187}$
$\left  x^4 z_6 \epsilon_{10}^2 \right  < 2^{-192}$	$\left  x^4 z_6 \epsilon_{10}^2 \right  < 2^{-252}$
$ z_1 z_1 z_6 \epsilon_9  < 2^{-128}$	$ z_1 z_1 z_6 \epsilon_9  < 2^{-188}$
$ z_4 z_6 \epsilon_8  < 2^{-128}$	$ z_4 z_6 \epsilon_8  < 2^{-188}$
$ z_7 \epsilon_7  < 2^{-127}$	$ z_7\epsilon_7  < 2^{-187}$
$ z_{12}\epsilon_7  < 2^{-175}$	$ z_{12}\epsilon_7  < 2^{-220}$
$ z_8\epsilon_6 + z_{11}  < 2^{-175}$	$ z_8\epsilon_6 + z_{11}  < 2^{-220}$
$ z_{11}\epsilon_6  < 2^{-175}$	$ z_{11}\epsilon_6  < 2^{-220}$
$ z_{23}\epsilon_5  < 2^{-174}$	$ z_{23}\epsilon_5  < 2^{-219}$
$ z_{24}\epsilon_5  < 2^{-126}$	$ z_{24}\epsilon_5  < 2^{-188}$
$ z_{14}\epsilon_4  < 2^{-159}$	$ z_{14}\epsilon_4  < 2^{-189}$
$ z_{22}\epsilon_4  < 2^{-175}$	$ z_{22}\epsilon_4  < 2^{-220}$
$ z_{25}\epsilon_3  < 2^{-158}$	$ z_{25}\epsilon_3  < 2^{-188}$
$ z_{26}\epsilon_3  < 2^{-125}$	$ z_{26}\epsilon_3  < 2^{-185}$
$ z_{17}\epsilon_2  < 2^{-143}$	$ z_{17}\epsilon_2  < 2^{-158}$
$ z_{27}\epsilon_2  < 2^{-124}$	$ z_{27}\epsilon_2  < 2^{-184}$
$ z_{28}\epsilon_1  < 2^{-142}$	$ z_{28}\epsilon_1  < 2^{-157}$
$ z_{20}\epsilon_1  < 2^{-141}$	$ z_{20}\epsilon_1  < 2^{-156}$
and therefore	and thus
$ \Delta  < 2^{-122}$	$ \Delta  < 2^{-155}$
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This are the properties to be proven.

Further, on inspection of the reconstruction sequence, one notices also that the parallelism the processor is capable of is not fully exploited. In addition, as the particularities of this part of the algorithm for the cases where more than 128 bits are needed to decide the rounding are relatively well known, one can set the use of some supplementary normalization <code>Fast2Sum</code> sequences aside. This deliberations have led to a new reconstruction part by which the over all latency of the algorithm has been reduced to 92 cycles:

```
fma u_1 = t_h, p_h, f0
(1)
                                                                   u_2 \leftarrow \left\langle x^l \cdot t^h + t^l \right\rangleu_5 \leftarrow t^l \otimes p^h
              fma u_2 = x_1, t_h, t_1
(1)
(2)
              fma u_5 = t_1, p_h, f0
                                                                     \begin{array}{l} u_1 + u_3 \leftarrow \textit{Fast2Mult}\left(t^h, p^h\right) \\ u_4 \leftarrow \left\langle t^h \cdot p^l + u_2 \right\rangle \end{array}
(5)
              fms u_3 = t_h, p_h, u_1
(5)
              fma u_4 = t_h, p_1, u_2
              fadd s_h = t_h, u_1
(6)
                                                                     u_6 \leftarrow \langle u_1 \cdot x^l + u_5 \rangle
(6)
              fma u_6 = u_1, x_1, u_5
                                                                      u_{10} \leftarrow u_3 \oplus u_4
(9)
              fadd u_10 = u_3, u_4
(10)
              fsub u_8 = s_h, t_h
                                                                      u_{11} \leftarrow u_{10} \oplus u_6
(13)
              fadd u_11 = u_10, u_6
                                                                      s^h + u_9 \leftarrow \textit{Fast2Sum}(t^h, u_1)
              fsub u_9 = u_1, u_8
(14)
                                                                      s^l \leftarrow u_{11} \oplus u_0
              fadd s_1 = u_11, u_9
(18)
```

One can easily verify that this sequence has the same behaviour as the reconstruction algorithm we showed above on the cases where the argument x of the exponential function is  $|x| < 2^{-30}$ . This property guarantees that the parts of the correction proof concerning the very hard cases of the table maker's dilemma are still verified.

Concerning the accuracy of this phase for other arguments in other ranges, we will show in the following that the sequence calculates

$$s^h + s^l = \left(t^h + t^l\right) \cdot \left(1 + \left(p^h + p^l\right)\right) \cdot \left(1 + x^l\right) + \Delta$$

with  $|\Delta| < 2^{-122}$  if  $t^h$ ,  $t^l$ ,  $p^h$ ,  $p^l$  and  $x^l$  are in the ranges given in theorem 2.19 on page 30.

**Proof** Using a similar approach as for the sections above, one obtains that  $\Delta$  can be expressed as

$$\Delta = -t^{l}p^{l} - t^{l}x^{l} - t^{h}p^{l}x^{l} - t^{l}p^{h}x^{l} - t^{l}p^{h}x^{l} + t^{l}p^{h}\epsilon_{8} + t^{h}p^{h}x^{l}\epsilon_{7} + u_{1}x^{l}\epsilon_{6} + x^{l}t^{h}\epsilon_{5} + t^{l}\epsilon_{5} + t^{h}p^{l}\epsilon_{4} + u_{2}\epsilon_{4} + u_{3}\epsilon_{3} + u_{4}\epsilon_{3} + u_{10}\epsilon_{2} + u_{6}\epsilon_{2} + u_{11}\epsilon_{1} + u_{9}\epsilon_{1}$$

with  $\epsilon_i \leq 2^{-64}$ .

By locating the absolute maximum of each of the monoms of this expression, we get

$$|t^l p^l| < 2^{-141}$$

$$\begin{split} \left|t^l x^l\right| &< 2^{-142} \\ \left|t^h p^l x^l\right| &< 2^{-156} \\ \left|t^l p^h x^l\right| &< 2^{-156} \\ \left|t^l p^h x^l\right| &< 2^{-220} \\ \left|t^l p^h \epsilon_8\right| &< 2^{-141} \\ \left|t^h p^h x^l \epsilon_7\right| &< 2^{-156} \\ \left|u_1 x^l \epsilon_6\right| &< 2^{-156} \\ \left|x^l t^h \epsilon_5\right| &< 2^{-142} \\ \left|t^l \epsilon_5\right| &< 2^{-142} \\ \left|t^h p^l \epsilon_4\right| &< 2^{-141} \\ \left|u_2 \epsilon_4\right| &< 2^{-127} \\ \left|u_3 \epsilon_3\right| &< 2^{-141} \\ \left|u_4 \epsilon_3\right| &< 2^{-126} \\ \left|u_{10} \epsilon_2\right| &< 2^{-125} \\ \left|u_6 \epsilon_2\right| &< 2^{-140} \\ \left|u_{11} \epsilon_1\right| &< 2^{-124} \\ \left|u_9 \epsilon_1\right| &< 2^{-127} \\ \end{split}$$

and therefore we have

 $|\Delta| < 2^{-122}$ 



These results show that this 92 cycle version of the algorithm can also be considered as correctly rounding.

It has been tested on the IMLTS system and on a potentially exhaustive list of 6344 arguments to the exponential function in double precision which the table maker's dilemma occurs with a need to know at least 100 correct bits to ensure the correct rounding. This list has been obtained using the algorithm Lefèvre has presented in [7]. No rounding error could be found neither with IMLTS neither on the list of arguments.

A more complete proof, written perhaps using a theorem proving tools such as Coq [24], could strengthen our confidence in this result. This is left to further work.

One should remark that the task of finding an optimally scheduable sequence having a appropriate accuracy for the calculation of a polynomial is very difficult for the following reasons: as Harrison remarks in [20] there are non-trivial factorizations of a polynomial that

make the search space already very large. In addition, since scheduling instructions with flow dependency constraints is  $\mathcal{NP}$ -complete [22], the task becomes already unfeasible even if one could argue that the length of usual polynomials and thus the maximum number of instructions needed is small enough to be exhaustively searched. But if one considers that for each appropriate sequence found, a formal accuracy proof must be written, a solution will almost always be suboptimal. In [20], accuracy issues are not considered in detail as all calculations are supposed to be ported out in native precision.

Despite, as one has been able to see throughout this article, the representation of higher precision intermediate results can be very effective. Further studies of the scheduling problem should perhaps be done taking into account such a representation.

## 5 Conclusion

To our opinion, several points seem to be a result of this work. Let us consider some of them:

- In contrast to others [6], we recommend the correctly rounded evaluation of the exponential function in only phase when special hardware features are available, which is nowadays commonly the case. The presented algorithm outperforms the so called 'quick' phase of the two-phase algorithm given in [6]. On some arguments, the performance gain can reach up to a 100 times speed-up and more. The overhead induced by the 'artificial' high precision arithmetic used in this competitor's algorithm and the strict limitation to double precision arithmetic even when more precision is available could be two of the reasons for this behaviour. We conceed to the authors of this algorithm that it is theoretically fully portable which our is not. Since the authors remark [6] that their function is outperformed only slightly by other libraries such as the one provided by IBM [18], one can consider the algorithm we presented to be a good concurrent to such an implementation that uses in fact Ziv's multilevel strategy which has very great impacts on the maximum timings [6, 2, 18].
- As a consequency of the single-level evaluation without any need to call other helper functions out of high-precision libraries, the implementation has not to deal with the eventual overhead of this calls. The code has tendancy to be more local which can be an advantage concerning the caching behaviour of modern processors.
- With a main path latency of 172 cycles on the Itanium 2 processor, the algorithm is only approximately 4 times slower than less accurate algorithms which are highly tuned for performance, such as the algorithm proposed by the Intel Numerics group in [17]. The implementation given in this paper could therefore be the basis of a library of correctly rounded functions whose normalization and common use would permit the formal proof of higher level algorithms [8]. Since more and more floating point units implementing a fused-multiply-add make their apparition [6] in modern CPUs further optimisation could permit to use correctly rounded algorithms in every-day-applications creating this way a new standard.

- The maximum latency of our algorithm can very easily be bounded and does not depend on the value of the input argument<sup>16</sup>. Other implementations such as [18, 19] cannot provide bounds on the maximum latency of their functions independently of the input arguments, others like [6] can only give maximum bounds which are approx. 20 times higher as the mean value. For our implementation, the maximum value equals the mean time latency.
- Our function uses completely the same main path for all rounding modes which is read in the user floating point register as defined in the IEEE 754 standard [5]. Other implementations such as [19, 6] only provide different functions for the different rounding modes which must be run in addition in round-to-nearest mode in order produce correct results. This behaviour of our function makes it fully IEEE 754 compliant and faciliates the application programmer's work.
- As the reader has seen, the task of proving the accuracy of an algorithm such as the one we give is horribly complex and time consuming. Unfortunately, no human being can work completely errorfree. Though some experience is needed to write such an accuracy proof, its final realization is a extremly complex but relatively mechanically task. A typical implementation of a transdecendental function even does not make use of high order control sequences such as while loops etc, which could be a possible problem in the decidability of a property of an algorithm. Before concentrating on establishing hand-written proofs for implementations of every transcedental function in common use, more research should perhaps be done on some tool offering the possibility to estimate quickly the accuracy of an algorithm. This approach would provide us also the possibility to 'play' with an implementation in order to optimize it for performance which can only difficultly be done when one has to write and rewrite the error proof each time one changes 2 or 3 instructions.

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<sup>&</sup>lt;sup>16</sup>The cases where the call of a under-/ overflow trap must be taken, which increases slightly the latency, can be defined clearly.

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# 7 Appendix: Complete listing of the algorithm

```
.data
  .align 16
// First table entries for the constants needed.
// rest variety // rest variet
    exp_constants:
  .section .text
    .global crexp#
.proc crexp#
.align 32
    .explicit
crexp::
{ .mlx
addl
                                                               = @ltoff(exp_constants), gp
= 0xb8aa3b295c17f0bc
                                                                                                                                                           // Load the constants' table's addresses's address
        movl
                                  rInv_ln2
                                                                                                                                                          // load significant of inv_ln2
                                rExp_2_M_56 = 0xffff-49, r0
rRSHF_2_56 = 0x46f8000000000000
                                                                                                                                                           // Form exponent for rescaling fk
        movl
                                                                                                                                                          // Form shift constant
                                // Form shift constant
        setf.d
        movl
                                                                                                                                                          // Form shift constant
        // form inv_ln2 = 1/ln(2) * 2^63
                                                                                                                                                          // Normalize the input value to register format // Form exponent for no calc testf
;; { .mfi setf.exp f2_M_56 fclass.m p9, p0 nop.i 0
                                                                  = rExp_2_M_56
= f8, 0x07
                                                                   = [rADD]
                                                                                                                                                          // Get the address of the constants' table
        1d8
        setf.exp fMin_Calc_Arg = rExpMinArg
fclass.m p8, p0 = f8, 0x22
                                                                                                                                                           // Form max not 1+x test constant
                                                                                                                                                          // Test if x == -inf
                                                                                                                                                          // Form shift constant
                                fRSHF
                                                                      = rRSHF
                                rADD_tmp
                                                                                                                                                          // Trick to overcome the 5 cycle latency of the offset-add of the load
                                                                      = 16, rADD
        add
        fclass.m p10, p0
adds rADD_tmp2
                                                                      = f8, 0x1e1
                                                                                                                                                            // Test if x == +inf, nan, NaT
  } { .mfb
    ldfe fl_h
(p9) fma.d.s0 f8
(p9) br.ret.spnt b0
                                                                     = [rADD], 32
= f1, f1, f0
                                                                                                                                                          // Load high part of ln(2)/2^14
// Fast exit for 0
  .mfi
ldfe
                                                                     = [rADD_tmp], 32
= fx
                                                                                                                                                          // Load low part of ln(2)/2^14 // Calculate absolute value of x for test |x| < 2^-54
        fabs
                                f Abs X
   { .mfb
        nop.m
  (p8) fma.d.s0 f8
(p8) br.ret.spnt b0
};;
                                                                                                                                                          // Fast exit for -inf
                                                                      = f0, f0, f0
```

```
// We are now in the range reduction phase
// We calculate
// w = x * inv_ln2
// k = int(w)
 // x = k * ln2 2 14 + x + x 1 + \tau
// The error \tau is less than 2^-118
// In the same time, we load the polynomial,
// calculate the integer version of k and
// start { .mfi nop.m 0 fma.si fq_1 -dd1 rADD_2
 // start the evaluation of the polynomial.
                                 = fx, fInv_ln2, fRSHF_2_56
= @ltoff(exp_table_2), gp
                                                                          // Inv_ln2 is scaled by 2^63, shift by adding 1.1 * 2^(63 + (63 - 14))
                                                                          // Get 2nd table entries' address's address
}
{ .mfb
 nop.m 0
(p10) fma.d.s0 f8
(p10) br.ret.spnt b0
                                                                          // Fast exit for +inf, nan, NaT
// Fast exit for +inf, nan, NaT
                                 = f8, f8, f0
 (.mfi
   nop.m 0
fcmp.le.si pii, p0
                                 = fAbsX, fMin_Calc_Arg
                                                                          // Test if |x| < 2^-53
 ;;
{ .mfi
fms.s1
                                 = fq_1, f2_M_56, fRSHF
                                                                          // Form float k by rescaling and substracting the shift constant
   nop.i
 .mfi
ld8
                                 = [rADD_2]
                                                                          // Get the address of the 2nd table's entries
               rADD_2
   nop.i
} ;;
{ .mfb
                                                                          // Form int version of k, Attention: we have still two leading ones too much // Fast exit for |x| \le 2^{\alpha}-54 // Fast exit
 getf.sig rk
(p11) fma.d.s0 f8
                                 = fq_1
= f1, fx, f1
 (p11) br.ret.spnt b0
 ;;
{ .mfi
   ldfe
fnma.s1
                                                                        // Load polynomial coefficient a_7
// Calculate high part of preliminary reduced arge
              fa_7
fr_h
                                 = [rADD], 48
                                 = fk, fl_h, fx
   nop.i
 .mfi
ldfe
   ldfe fa_6
fnma.s1 fr_1
                                 = [rADD_tmp], 32
= fk, fl_1, f0
                                                                          // Load polynomial coefficient a_6
                                                                          // Calculate low part of preliminary reduced arg
   nop.i
} { .mfi
                                  = 0xffff-1
                                                                          // Form exp for h = 1/2
   mov
               rExp_h
   nop.f
nop.i
 ;;
{ .mfi
                                                                          // Load polynomial coefficient a_5;; // Normalize the reduced arg (r+x_-1)=(r_-1+r_-1) with |x_-1|<2^-64*|r_-1|
                                  = [rADD_tmp2]
   fadd.s1 fr
                                  = fr_h, fr_1
   nop.i
 ;; // The exponential of the reduced argument is approximated by a 6 degree polynomial, as follows:
 /// p_h + p_l = (r + ((1/2*(r*r)) + (((r*r)*r)*((a_4_h + a_4_l) + ((a_5 + (a_6 + a_7*r)*r)*r))))) + \Delta, |\Delta| < 2^-124
 // The polynomial is chosen so that it approximates \exp(x) in |x|<1n(2)/2^15 with a maximal error of 2^{n-123}
 '/'
The exponential \exp(x, 1) of the lower part of the reduced argument, x, 1, is approximated by (1 + x, 1).

// This is sufficient, since |x, 1| < 2^-79 and so x, 1^2 < 2^-158 and the Taylor series of \exp(x) converges very fast.
= fa_7, fr, fa_6
                                                                         // Start evaluation of the polynomial
   fma.s1
               f z_1
   nop.i
;;
{ .mfi
                                                                          // Load the high part of the polynomial coefficient a\_4\_h // Get bits 8 to 14 for the 2nd index
   ldfe
               fa 4 h
                                  = [rADD], 16
shr
};;
{ .mfi
```

```
// Form constant h = 1/2
// Polynomial
// Mask the other parts of the integer
   \begin{array}{lll} \text{setf.exp} & \text{fh} \\ \text{fma.s1} & \text{fz}\_2 \\ \text{and} & \text{rInd}\_1 \end{array}
                                       = rExp_h
= fz_1, fr, fa_5
= 0x7f, rk
fma.s1
and
}
{ .mfi
                                       = fr, fr, f0
= rk, 2
                                                                                      // z_1i_h + z_1i_l = r^2 exactely by means of fma;;
// Get rid of the two leading ones (1.1)
   shl
} ;;
{ .mfi
nop.m
fma.s1
                                       = fz_2, fr, f0
= 0x7f, rk_128
                                                                                      // z_3_h + z_3_l = (a_5 + (a_6 + (a_7*r)*r)*r + \Delta_1, |\Delta_1| < 2^-82 // Mask the other parts of the integer
                 fz_3_h
   and
                 rInd_2
}
{ .mfi
   nop.m
fma.s1
nop.i
                 fz_12
0
                                       = fz_11_h, fr, f0
hop.i
   nop.m
fms.si
shr
                 fz_11_1
rM
                                       = fr, fr, fz_11_h
= rM, 16
                                                                                        // Low part of z_11_h/l // Get bits 15, 16, ... for M, we had shifted to the left by 2 thus 16
} { .mfi nop.m fma.s1
                 0
fz_23
                                       = fz_11_h, fh, f0
} ;;
{ .mfi
nop.m
fadd.s1
                 0
fz_4
                                       = fa_4_h, fz_3_h
= rInd_1, 5
   shl
                  rInd 1
                                                                                       // Multiply index by 32 (32 bytes per index)
}
{ .mfi
nop.m
fms.s1
shl
}
                 fz_3_1
rInd_2
                                       = fz_2, fr, fz_3_h
= rInd_2, 5
                                                                                       // Low part of z_3_h/1
// Multiply by 32
   nop.m 0
fms.s1 fz_13
                                       = fz_11_h, fr, fz_12
   nop.i
{ .mfi
nop.m 0
famin.s1 fq_5_0
                                       = fr_h, fr_1
                                                                                    // Get min of r_h and r_l (in magnitude)
   nop.i
}
{ .mfi
   nop.m
fms.s1
                 fz_24
                                       = fz_11_h, fh, fz_23
;;
{ .mfi
   ldfe fa_4_1
fsub.s1 fz_5
                                       = [rADD], 16
= fz_4, fa_4_h
                                                                                        // Load the low part of the polynomial coefficient a\_4\_1
   nop.i
hop...
}
{ .mfi
   nop.m 0
famax.s1 fq_5_1
add rTbl_2
                                                                                        // Get max of r_1 and r_h (in magnitude) Do not change the order of r_h and r_1 // Index the 2nd table
                                       = fr_1, fr_h
= rInd_2, rADD_2
;;
{ .mfi
   \begin{array}{ll} \texttt{nop.m} & \texttt{0} \\ \texttt{fsub.s1} & \texttt{fz\_6} \end{array}
                                       = fz_3_h, fz_5
   nop.i
{ .mfi
mov
fma.s1
                                       = 0xffff
= fz_11_1, fr, fz_13
                rExp_bias
fz_14
                                                                                        // Load bias for 2^M float generation
nop.i
}
{ .mfi
                                       = [rTb1_2], 16
= fz_11_1, fh, fz_24
                                                                                       // Load high part of 2nd table entry, add 16 to addr
   ldfe
                 ft_2_h
fz_25
   fma.s1
   nop.i
} { .mfi
   nop.m 0
fsub.si fq_5_2
                                       = fq_5_1, fr
                                                                                        // Prepare final calculation of the reduced argument
nop.i
```

```
;; { .nmf | fMin_dbl_oflow_arg, fMax_dbl_zero_arg = [rADD], 16 // Load overflow, underflow, denormal etc. test constants fadd.si fz_7 = fz_3_1, fz_6
  } ;; { .mfi add rM_bias fadd.s1 fz_8
                                 = rM, rExp_bias
= fa_4_1, fz_7
                                                                          // Form biased M
    nop.i
  }
{ .mfi
                                  = [rTb1_2]
= fz_12, fz_14
                                                                          ft_2_1
    ldfe
    fadd.s1 fz_15_h
nop.i 0
    nop.i
  } { .mfi
    nop.m 0
fadd.s1 fz_26_h
                                  = fz_23, fz_25
                                                                          // z_26_h + z_26_l = h * (z_11_h + z_11_l) + \Delta_6, |\Delta_6| < 2^-159
  } { .mfi
  1 .mr1
nop.m 0
fadd.si fx_l
nop.i 0
};
{.mfi
nop.m 0
fcmp.ge.si p12, p0
nop.i 0
                                  = fq_5_2, fq_5_0
                                                                         // Calculate the lower part of the reduced argument
                                  = fx, fMin_dbl_oflow_arg
                                                                         // Test if we have a certain overflow cas
    nop.i
               fMax_dbl_norm_arg, fMin_dbl_norm_arg = [rADD], 16 // Load constants, after this load, rADD points to the first table fz_9_h = fz_4, fz_8 // z_9_h + z_9_l = ((a_4_h + a_4_l) + (z_3_h + z_3_l)) + \Delta_2, |\Delta_2| < 2^-130
    ldfpd
    fadd.si fz_9_h
nop.i 0
  } { .mfi
    nop.m 0
fcmp.le.si p13, p0
                                  = fx, fMax_dbl_zero_arg
                                                                          // Test if we have a certain underflow case
    nop.i
   setf.exp f2M
fma.s1 fz_17
                                                                          // Form 2^M final multiplication value
                                   = rM_bias
                                  = fz_9_h, fz_15_h, f0
    nop.m 0
fsub.s1 fz_10
  fsub.s1 fz_10 = fz_9_h, fz_4

(p12) br.cond.spnt EXP_CERTAIN_OVERFLOW
  } ;;
{ .mfi
    nop.m 0
fsub.s1 fz_16
                                  = fz_15_h, fz_12
   nop.i
} { ...fb | nop.m 0 | fsub.s1 | fz_27 | '3) br.cond.spn!
  fsub.si fz_27 = fz_26_h, fz_23 (p13) br.cond.spnt EXP_CERTAIN_UNDERFLOW } . . .
  } ;;
{ .mfi
    nop.m
fms.si
add
               fz_18
rTbl_1
                                  = fz_9_h, fz_15_h, fz_17
= rInd_1, rADD
                                                                          // Index the first table
  }
{ .mfi
   nop.m 0
fsub.si fz_9_1
nop.i 0
                                  = fz_8, fz_10
  = fz_14, fz_16
                                                                         // Low part of z_15_h/1
 .sub.s
nop.i
}
  .mfi
    nop.m 0
fsub.s1 fz_26_1
                                  = fz_25, fz_27
                                                                         // Low part of z_26_h/1
  nop.i
};;
{ .mfi
    nop.m
fma.s1
                fz_19
                                  = fz_9_1, fz_15_h, fz_18
 nop.i
```

```
{ .mfi
  nop.m 0
fcmp.gt.si p14, p0
                                  = fx, fMax_dbl_norm_arg
                                                                           // Test for possible overflow (it might be but it needs not)
fcmp.gu.si piz, p
nop.i 0
};;
{ .mfi
ldfe ft_1_h
fma.s1 fz_20
                                  = [rTbl_1], 16
= fz_9_h, fz_15_1, fz_19
                                                                           // Load high part of the first table entry, add 16 for the next value
   nop.i
}
{ .mfi
nop.m 0
fcmp.lt.si pi5, p0
nop.i 0
l;;
{ .mfi
nop.m 0
fadd.si fz_21_h
nop.i 0
                                 = fx, fMin_dbl_norm_arg
                                                                           // Test for possible underflow (it might be but it needs not)
                                  = fz_17, fz_20
nop.i 0
};;
{ .mfi
ldfe    ft_1_1
fadd.s1    fz_28
                                  = [rTb1_1]
= fz_26_h, fz_21_h
                                                                            // Load low part of the first table entry
   nop.i
} { .mfi
   nop.m 0
fsub.s1 fz_22
nop.i 0
                                 = fz_21_h, fz_17
}
{ mfi
   nop.m
fma.s1
                                  = ft_1_h, ft_2_h, f0
   nop.i
   nop.m 0
fsub.s1 fz_29
                                  = fz_28, fz_26_h
   nop.i
} { .mfi
   nop.m 0
fsub.s1 fz_21_1
nop.i 0
                                  = fz_20, fz_22
                                                                        // Low part of z_21_h/l
{ .mfi
nop.m
fms.s1
              0
fu_2
                                  = ft_1_h, ft_2_h, fu_1
   nop.i
 ;;
{ .mfi
   nop.m 0
fsub.s1 fz_30
nop.i 0
                                  = fz_21_h, fz_29
nop.i 0
};;
{ .mfi
nop.m 0
fadd.s1 fz_31
nop.i 0
}
                                  = fz_21_1, fz_30
{ .mfi
nop.m 0
fma.si fu_3
                                  = ft_1_h, ft_2_1, fu_2
nop.i
} ;;
{ .mfi
   nop.m 0
fadd.s1 fz_32
nop.i 0
                                  = fz_26_1, fz_31
nop.1
   nop.m
fma.s1
                                  = ft_1_1, ft_2_h, fu_3
nop.i 0
};;
{.mfi
nop.m 0
fadd.si fz_33_h
                                  = fz_28, fz_32
                                                                            // z_33_h + z_33_l = (z_26_h + z_26_l) + (z_21_h + z_21_l) + \Delta_7, |\Delta_7| < 2^-158
}
// Start of the table value multiplication phase and end of polynomial approx. phase { .mfi
   nop.m
```

```
fadd.s1 ft_h
                              = fu_1, fu_4
                                                                   // t_h + t_l = 2^(ind_1/2^7) * 2^(ind_2/2^14) + Delta, |Delta| < 2^-123
   nop.i
nop.1
}
;;
{ .mfi
                              = fz_33_h, fr
  nop.i
} { .mfi nop.m fsub.s1
                              = fz_33_h, fz_28
             fz_34
   nop.i
}
{ .mfi
  nop.m
fma.s1
nop.i
             f v_1_h
                              = fx_1, ft_h, f0
} { .mfi
  nop.m
fsub.si
nop.i
                              = ft_h, fu_1
= fz_35, fr
                              = fz_32, fz_34
  nop.i
lop.1 0
}
{ .mfi
    nop.m 0
    fadd.s1 fv_3_h
                              = ft_h, fv_1_h
   nop.i
}
{ .mfi
  nop.m
fms.si
nop.i
             f v_1_1
0
                              = fx_1, ft_h, fv_1_h
} { .mfi
  nop.m
fsub.s1
                                                                   // Lower part of reconstructed table lookup value t_{\rm -}h/1
             ft_1
                              = fu_4, fu_5
nop.i
} ;;
{ .mfi
   nop.m 0
fsub.s1 fz_37
                              = fz_33_h, fz_36
nop.i
} ;;
{ .mfi
nop.m 0
fsub.si fv_10
nop.i 0
};;
{ .mfi
nop.m 0
fadd.si fz_38
nop.i 0
                              = fv_3_h, ft_h
                              = fz_33_1, fz_37
radd.si
nop.i
} ;;
{ .mfi
nop.m
fadd.si
                                                                  // p_h + p_l = (z_33_h + z_33_l) + x + \Delta_8, |\Delta_8| < 2^-142
                              = fz_35, fz_38
            fp_h
0
nop.i
} ;;
{ .mfi
  nop.m
fma.si
nop.i
             f v_4_h
                              = fp_h, ft_h, f0
} { .mfi
```

```
nop.m 0
fsub.si fz_39
nop.i 0
};;
{ .mfi
nop.m 0
fadd.si fv_8_h
nop.i 0
                                = fp_h, fz_35
                                = fv_3_h, fv_4_h
  nop.i
f .mfi
nop.m
fms.si
nop.i
             f v_4_1
0
                               = fp_h, ft_h, fv_4_h
}
{ .mfi
= fz_38, fz_39
                                                                    // Low part of the polynomial approx. value p_h/1
                               = fv_8_h, fv_3_h
nop.1
}
{ .mfi
nop.m
fma.si
nop.i
};;
{ .mfi
             0
f v_5
0
                               = fx_1, fv_4_h, fv_4_l
  nop.m 0
fma.si fv_6
nop.i 0
                               = fp_1, ft_h, fv_5
lop.i
                               = fv_4_h, fv_11
  nop.i
= fv_1_h, fv_10
             0
f v_7
0
  nop.m
fma.s1
nop.i
                               = ft_1, fp_h, fv_6
} { .mfi
  nop.m 0
fadd.s1 fv_2
nop.i 0
                               = ft_1, fv_1_1
;;
{ .mfi
  nop.m 0
fadd.si fv_9
nop.i 0
                               = fv_8_1, fv_7
nop.i
  nop.m 0
fadd.s1 fv_15
nop.i 0
                                = fv_3_1, fv_2
} ;; { .mfi nop.m 0 fadd.s1 fv_13
                               = fv_9, fv_15
nop.i
};;
{.mfi
= fv_8_h, fv_13
                                                                      // s_h + s_1 = (t_h + t_1) * (1 + (p_h + p_1)) * (1 + x_1) + \Delta, |\Delta| < 2^-124
                               = fs_h, fv_8_h
nop.i C
};;
{.mfi
nop.m 0
fsub.si fs_l
                               = fv_13, fv_14
                                                                  // Lower part of s_h/l
  nop.i
```

```
} ;; // End of the reconstruction phase, start of the multiplication by 2^M and final rounding \{\ .mfi
   nop.m
fma.si
                  fs_1_2M
                                         = fs_1, f2M, f0
    nop.i
} ;;
{ .mfb
 nop.m 0
fma.d.s0 f8 = fs_h, f2M, (p14) br.cond.spnt EXP_POSSIBLE_OVERFLOW
                                          = fs_h, f2M, fs_1_2M
                                                                                             // Branch if there could be an overflow
 f.mbb
nop.m 0
(p15) br.cond.spnt EXP_POSSIBLE_UNDERFLOW
br.ret.sptk b0 ;;
                                                                                             // Branch if there could be an underflow // Normal path exit
}
// General remark: do not change the order of the labeled parts of the code below. We rely on the conditional
// General remark: do not change the order of the faculty parts of the code wellow. ** leaf of the Continuation in the next section in some cases. Do not change the order of the code squences neither, they are // all scheduled for optimal performance, additionally we reuse some physical registers.
//
// This case should not happen if the input is a double number, because with a double
// we would be in the certain overflow case.
// With a higher precision input, there is a possibility.
// We recalculate the final result with a higher exponent range in which overflow does not occur.
// If this result is greater than the greatest double, we have a certain overflow.
// Chervise we return the already known result in f8.
 // For this calculations, we use status field number 2.
 EXP_POSSIBLE_OVERFLOW:
{ .mfi
    nov
                  rGtln
                                          = 0x103ff
                                                                                             // Exponent for largest dbl + 1 ulp
// Set wre (widest range enable)
   fsetc.s2 0x7F, 0x42
nop.i 0;;
 f mfi
   setf.exp fGtpln
fma.d.s2 fWRE_f8
                                          = rGt1n
= fs_h, f2N, fs_l_2M
                                                                                             // Form greatest dbl + 1 ulp
// Recalculate the result
   nop.i
                  0
 ( .mfi
   nop.m 0
fsetc.s2 0x7F, 0x40
                                                                                             // Turn wre off
   nop.i
}
{ .mfi
   nop.m 0
fcmp.ge.si p0, p6
nop.i 0;;
                                          = fWRE_f8, fGtpln
                                                                                             // Test if there would be an overflow in double prec.
} { .mfb
   nop.m 0
fma.d.s0 f8
                                          = fs_h, f2M, fs_1_2M
                                                                                              // Recalculate common result to have all flags correctly set
 (p6) br.ret.sptk b0 ;;
                                                                                             // Return if the test is false to the exp() caller
// otherwise continue with the certain overflow case below.
 EXP_CERTAIN_OVERFLOW:
EXP_CBmia_.

{ .mmi
mov rExpBig
setf.exp fBig
nop.i 0;;
                                                                                             // Do not remove the stop ! We use a bypass // Form big normal
                                          = 0x1ffff-1 ;;
                                          = rExpBig
}
{ .mfb
   nop.m 0
fma.d.s0 f8
                                         = fBig, fBig, f0
                                                                                             // Form +inf + flags
   br.ret.sptk b0 ;;
                                                                                              // Return
// We are in an underflow case iff we flush tiny (underflowed) numbers to zero when the ftz (flush to zero) flag is set. // So it suffices to recalculate the final result with ftz set in status register two. { .mfi
   nop.m
   fsetc.s2 0x7F, 0x41
nop.i 0;;
                                                                                             // Set ftz in status reg s2
} { .mfi
   nop.m 0
fma.d.s2 fFTZ_f8
nop.i 0
                                          = fs_h, f2M, fs_1_2M
                                                                                             // Recalculate the result with ftz
}
{ .mfi
   nop.m 0
fsetc.s2 0x7F, 0x40
                                                                                             // Turn ftz in s2 off
   nop.i
                  0;;
```

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