



# 10 years of reproducibility in biomedical research how can we achieve generalizability and fairness?

### **Camille Maumet**

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Irreproducible with...

Same Data

Lack of experimental details

Proposed solutions
Sharing code,
Programming best practices, etc.

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Same Data

Lack of experimental details

**Proposed solutions** Sharing code, Programming best practices, etc.



#### Open question $\Rightarrow$

How to ensure computational reproducibility with increasingly big sample sizes?



Talk 1 by Adina Wagner

Irreproducible with...

**Different Data** 

Irreproducible with...

**Different Data** 

#### False positive finding

Low statistical power

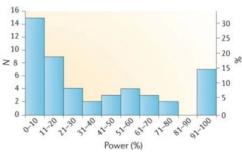
# SCIENCE A Waste of 1,000 Research Papers Decades of early research on the genetics of depression were built on nonexistent foundations. How did that happen? ED YONG MAY 17,2019

Power of neuroscience studies

SLC6A4, might influence a person's risk of depression.

It was a blockbuster discovery at the time. The team found that ale version of the gene was more common among 454 people who had disorders than in 570 who did not. In theory, anyone who had this 1 gene variant could be at higher risk for depression, and that finding might help in diagnosing such disorders, assessing suicidal behavic

In 1996, a group of European researchers found that a certain gene



[Button, Nat Rev Neurosci 2013]

The Atlantic Science, <u>"A waste of 1000 research papers"</u>, Ed Yong. The New York Times, <u>"Many Facial-Recognition Systems Are Biased, Says U.S. Study"</u>, By Natasha Singer & Cade Metz, 2019

Irreproducible with...

**Different Data** 

#### False positive finding

#### Lack of generalisability

A Waste of 1,000 Research Papers
Decades of early research on the genetics of depression were built on nonexistent foundations. How did that happen?

ED YONG. MAY 17, 2019

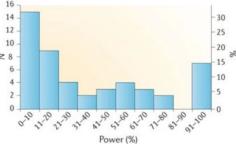


In 1996, a group of European researchers found that a certain gene, called SLC6A4, might influence a person's risk of depression.

It was a blockbuster discovery at the time. The team found that a less active version of the gene was more common among 454 people who had mood disorders than in 570 who did not. In theory, anyone who had this particular gene variant could be at higher risk for depression, and that finding, they sai might help in diagnosing such disorders, assessing suicidal behavior, or eve

[Border, Am J Psy. 2019]

## Power of neuroscience studies



The New York Times

### Many Facial-Recognition Systems Are Biased, Says U.S. Study

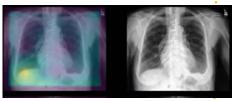
Algorithms falsely identified African-American and Asian faces 10 to 100 times more than Caucasian faces, researchers for the National Institute of Standards and Technology found.



biased, a new study confirmed. Timothy A. Clary/Agence France-Presse — Getty Imag

[Buolamwini, MIT 2017]

X-ray opacity detections



[Larrazabal, PNAS 2020]

[Button, Nat Rev Neurosci 2013]

The Atlantic Science, <u>"A waste of 1000 research papers"</u>, Ed Yong. The New York Times, <u>"Many Facial-Recognition Systems Are Biased, Says U.S. Study"</u>, By Natasha Singer & Cade Metz,. 2019

Irreproducible with...

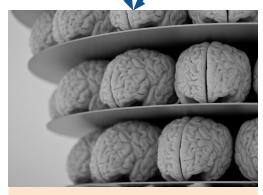
**Different Data** 

#### False positive finding

Low statistical power

#### Lack of generalisability

Unrepresentative sample



**Proposed solution**Data Sharing

Irreproducible with...

**Different Data** 

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**Proposed solution**Data Sharing



How can inclusivity support fairness?



Talk 4 by
Cassandra Gould
van Praag



#### Open question

How do scientific findings apply to subgroups of the population?

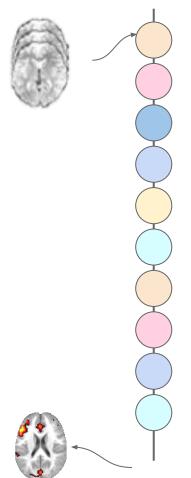


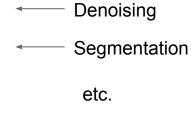
Talk 3 by
Melanie Ganz

## Fixing the reproducibility issue

Irreproducible with...

Different methods







#### Open question 🔆



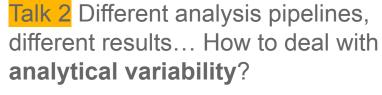
How does a finding obtained with a given analysis vary when computed using another tool or algorithm?



Talk 2 by Camille Maumet



Talk 1 Towards computational reproducibility when working with very large datasets





**Adina Wagner** Psychoinformatics Lab INM-7 Juelich Research Center Germany



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Talk 3 Fairness in biomedical imaging: overview and a case study in neuroimaging

Talk 4 How does inclusivity support fairness in biomedical imaging?



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