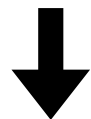


# Missing data

**by Sina Rüeger**

Notes & Material



[https://github.com/sinarueeger/teaching/tree/master/missing\\_data](https://github.com/sinarueeger/teaching/tree/master/missing_data)

# **Aim of this video**

**Discover the different facets of missing data by learning about**

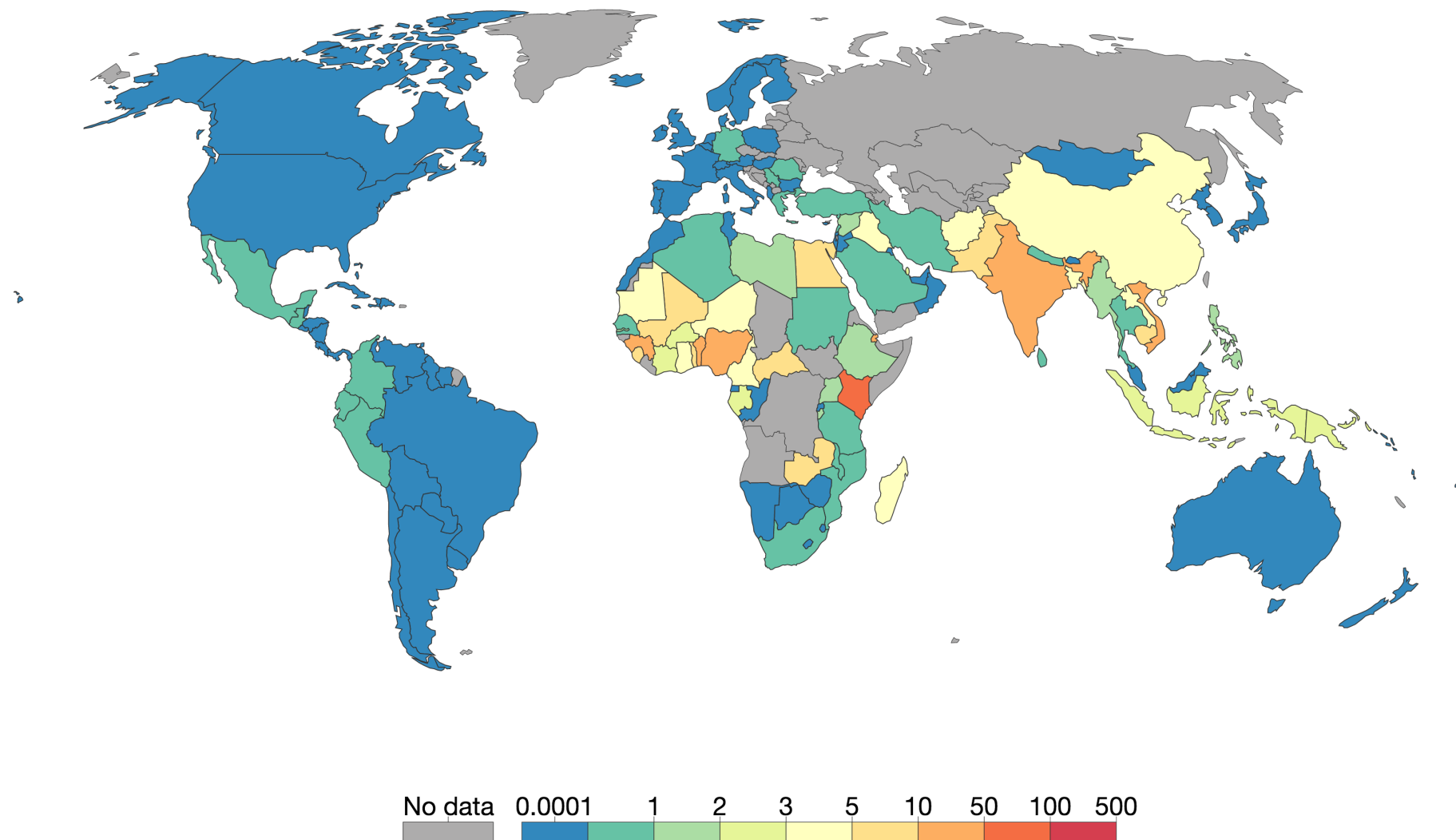
- why missing data occurs
- why missing data can be a problem
- how missing data can be turned in something meaningful

# Example "Polio"

Reported paralytic polio cases (per 1 million people), 1990

This includes the wild and vaccine (VAPP) type poliovirus (occurring indigenously and imported)

Our World  
in Data



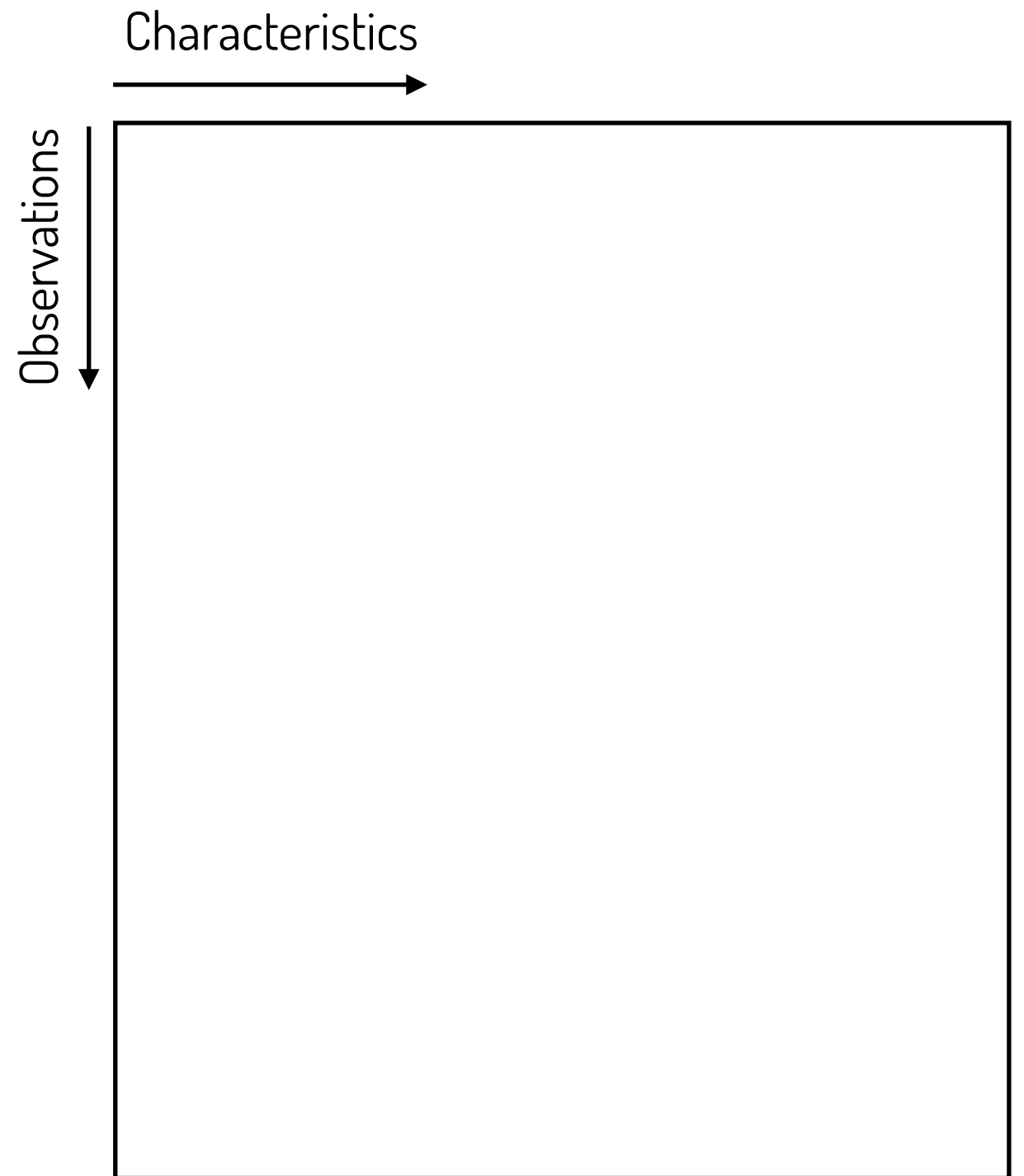
Source: Incidence Report of Selected Vaccine Preventable Diseases (VPDs) - WHO (2017)

OurWorldInData.org/polio/ • CC BY-SA

<https://ourworldindata.org/grapher/reported-paralytic-polio-cases-per-1-million-people>

# Recap: data

- One observation per row
- One characteristics measured per column



# Recap: data

Characteristics

Observations

Observation	Planet name	Surface [km2]	Discovered [dd-month-yyyy]
1	Pluto	$1.779 \times 10^7$	18-Feb-1930
2	Uranus	$8.116 \times 10^9$	13-Mar-1781
3	Saturn	$4.270 \times 10^{10}$	no data

Information from:  
<https://en.wikipedia.org/wiki/Pluto>  
<https://en.wikipedia.org/wiki/Uranus>  
<https://en.wikipedia.org/wiki/Neptune>

# Reasons for missing data

Data not reported

Technical issue > badly measured

No measurement possible

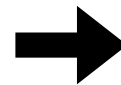
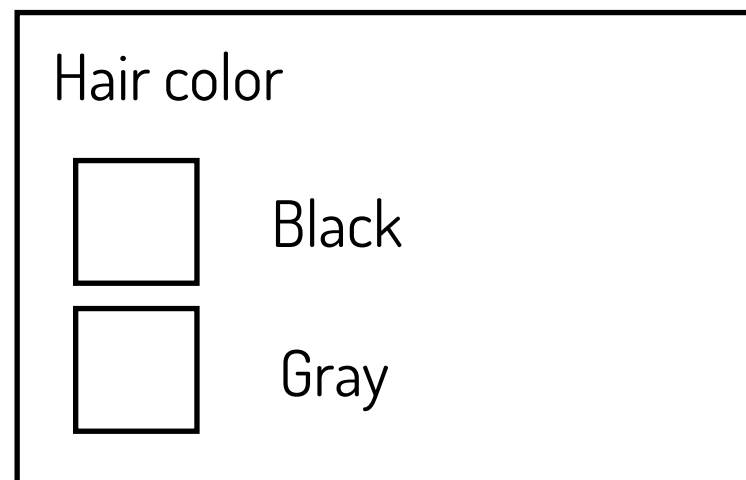
Poorly designed surveys

Hair color

<input type="checkbox"/>	Black
<input type="checkbox"/>	White

# When is missing data a problem

**When missingness is not occurring randomly, but somehow related to another variable.**



1. People with hair color other than black and gray will have missing values.
2. In this case, missing values can have the following origin:
  - Hair color correlates with ancestry.
  - Gray hair is associated with age.
  - Some people have no hair.

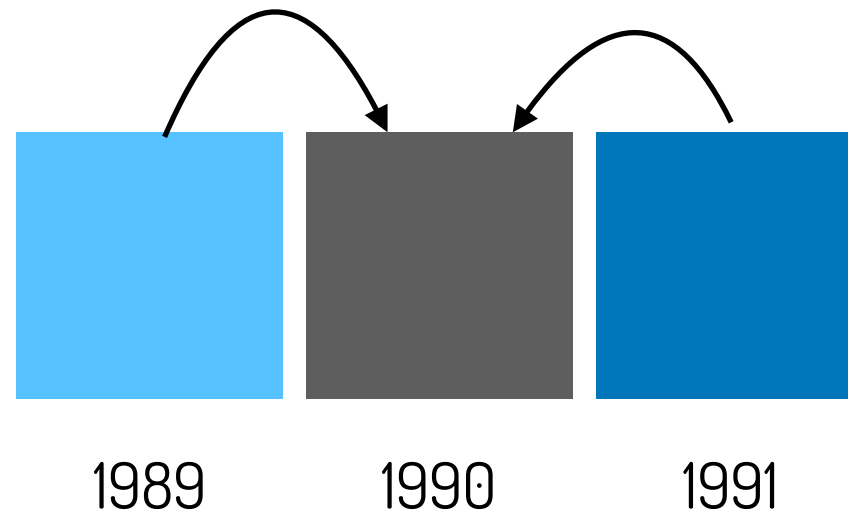
# Why is missing data a problem

1. Bias
2. Potentially lower sample size

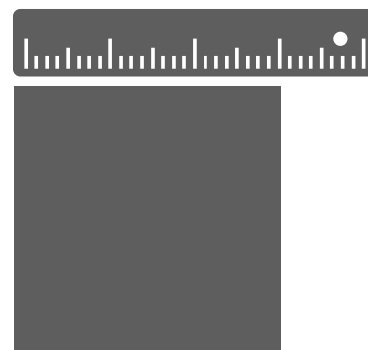


# Solutions

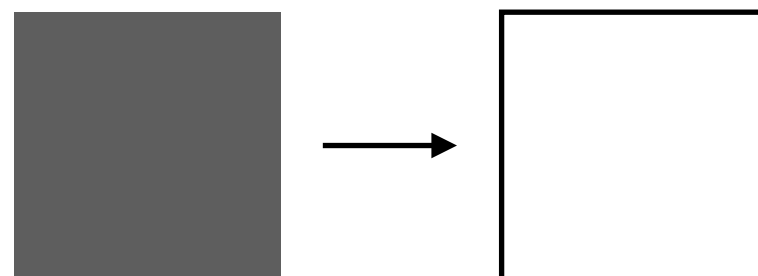
Imputation



Re-measuring



Removal

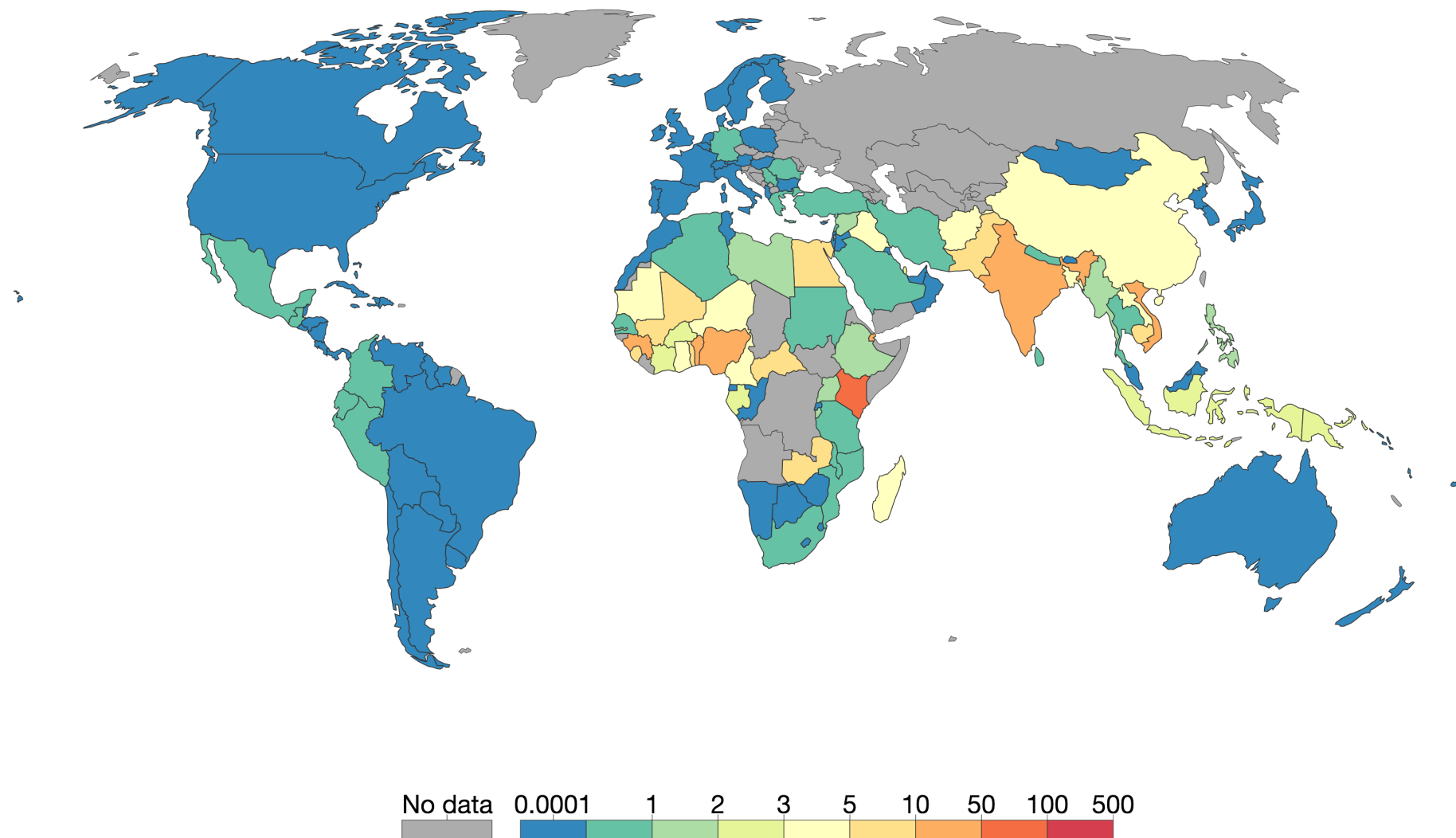


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Our World  
in Data



Source: Incidence Report of Selected Vaccine Preventable Diseases (VPDs) - WHO (2017)

OurWorldInData.org/polio/ • CC BY-SA

<https://ourworldindata.org/polio#data-quality-and-measurement>

# Summary

- ✓ why missing data occurs
- ✓ why missing data can be a problem
- ✓ how missing data can be turned in something meaningful

# Links

**Explore human civilisation through the lens of data**

<https://ourworldindata.org/>