

# From disconnected elements to a harmonious ecosystem

The Epiverse-TRACE project

Hugo Gruson

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*Piping system on a chemical tanker, by Hervé Cozanet, CC BY-SA.*

Modern pipelines are not made of fully interoperable pieces.

Lots of data wrangling is required to:

- Make successive pieces fit well with one another
- Swap one piece for another equivalent one



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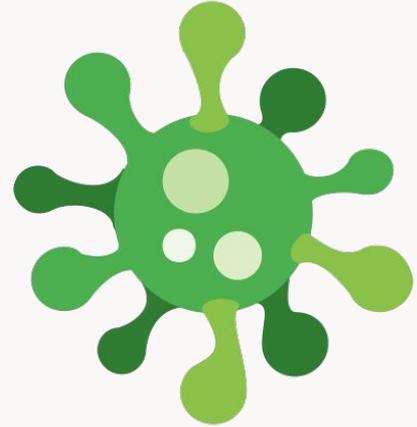
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### Secondary goals:

- Spread good practices in software development
- Advocate for the development of RSE career paths



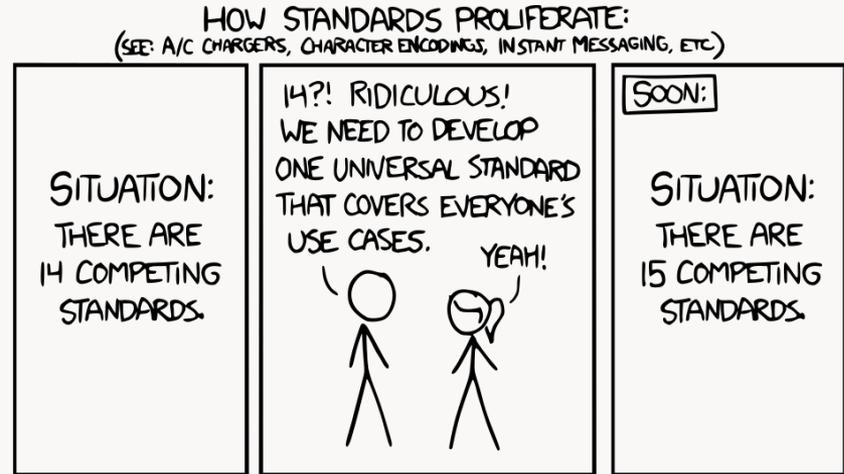
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XKCD 927: *Standards*, by Randall Munroe, CC BY-NC

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## Diversity is good but we also need interoperability!

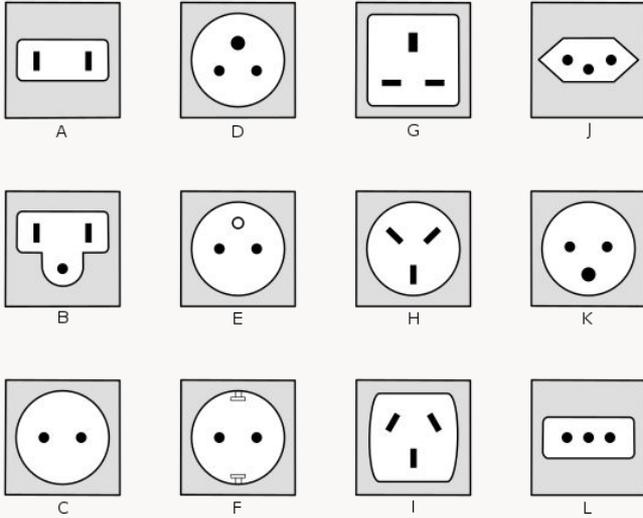
Our goal:

- Keep the diversity
- Buy-in from the community
- Collaborate to existing projects
- Be good open-source citizens

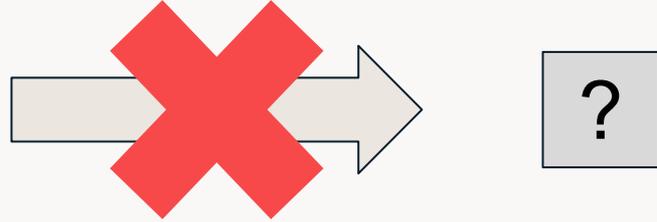
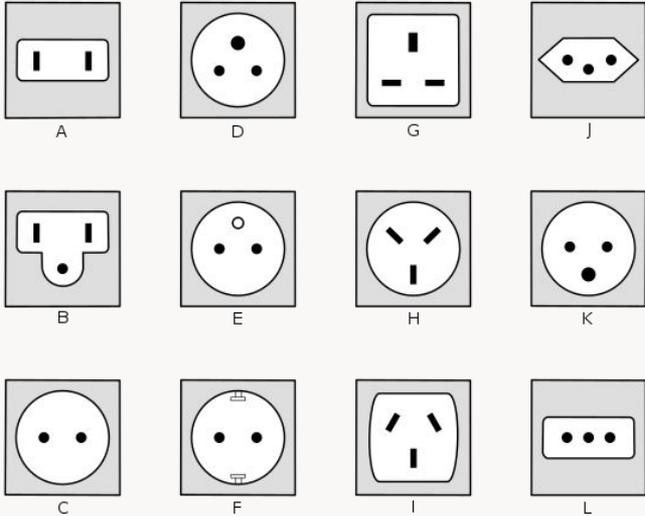


Create compatibility layers, not “one standard to rule them all”

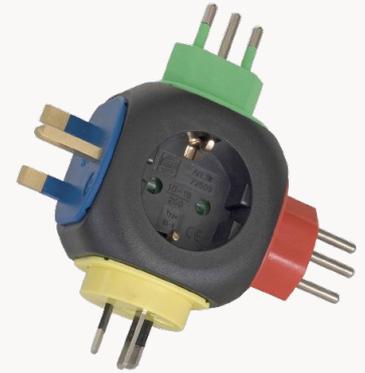
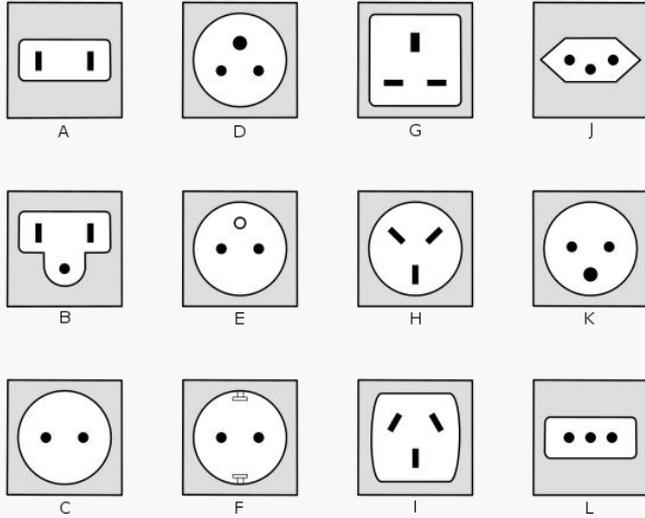
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*Reisestecker mit austauschbaren  
Adaptern für verschiedene Länder,  
by Cephira, CC BY-SA*

Building an interoperable ecosystem

## Building an interoperable ecosystem

Why spend time  
on this?

Why wouldn't I  
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This would  
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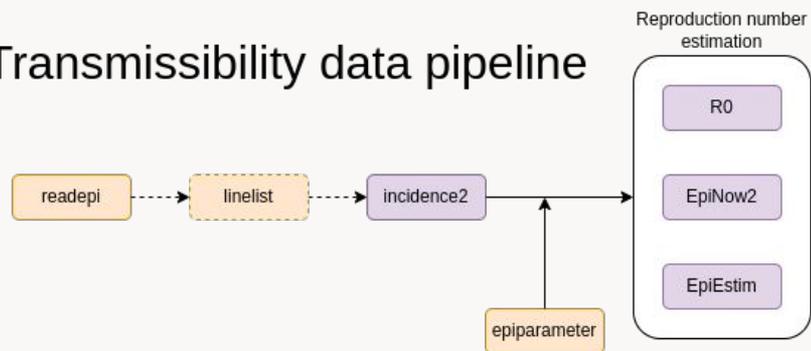
Interoperability is a socio-technical problem.

It's difficult to do right and not rewarded at all in career development.

# Developing community buy-in

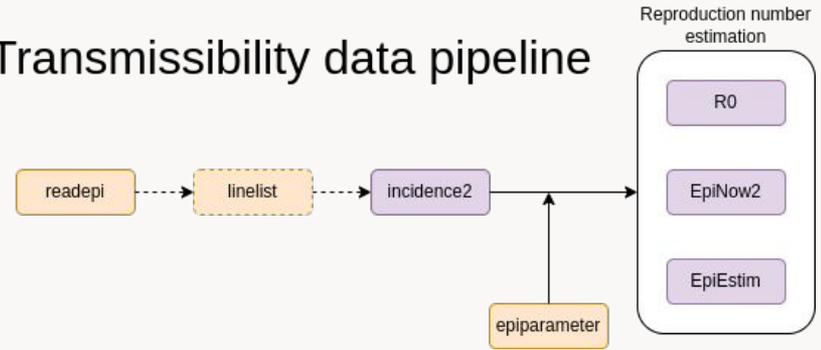
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## Transmissibility data pipeline



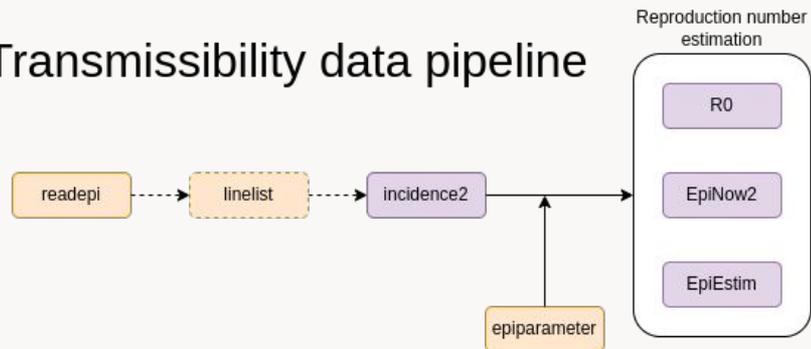
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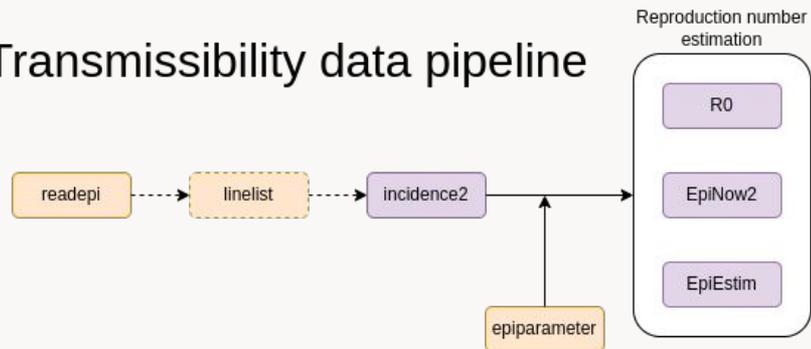
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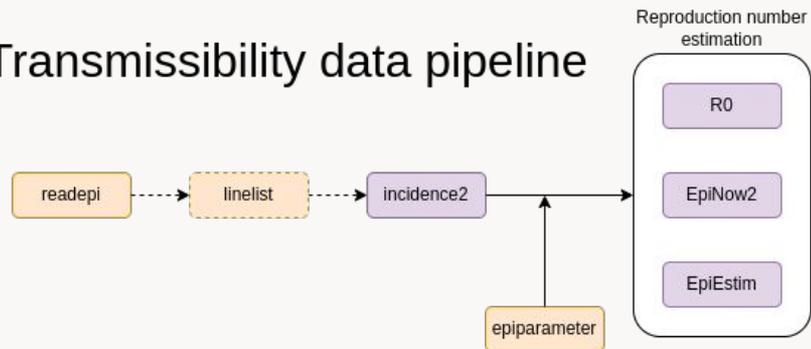
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3. Create a shared piece of underlying infrastructure to allow compatibility and simplify maintenance of shared tasks

## Transmissibility data pipeline



Adding interoperability  
while minimizing  
breaking changes

Using R S3 object orientation to transparently operate the change.

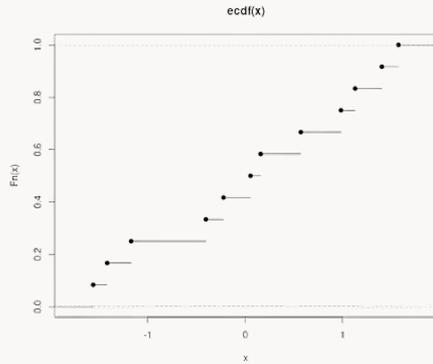
Using R S3 object orientation to transparently operate the change.

S3 is strange (like R):

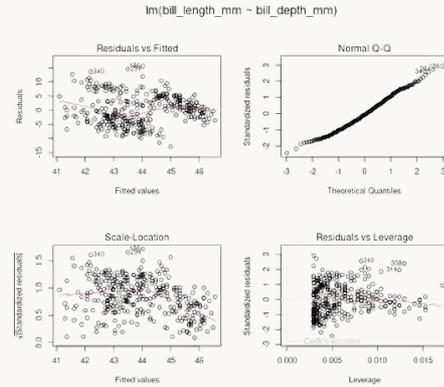
- *“S3 is informal and ad hoc, but there is a certain elegance in its minimalism: you can’t take away any part of it and still have a useful OO system.”* Hadley Wickham
- Mostly an advanced dispatch system based on the presence of the specific attribute
- Particularly useful because users don’t need to understand anything about OO

Using R S3 object orientation to transparently operate the change.

```
fn <- ecdf(rnorm(12))  
plot(fn)
```



```
m <- lm(bill_length_mm ~ bill_depth_mm, data = penguins)  
plot(m)
```



Fix both ends of each pipe:

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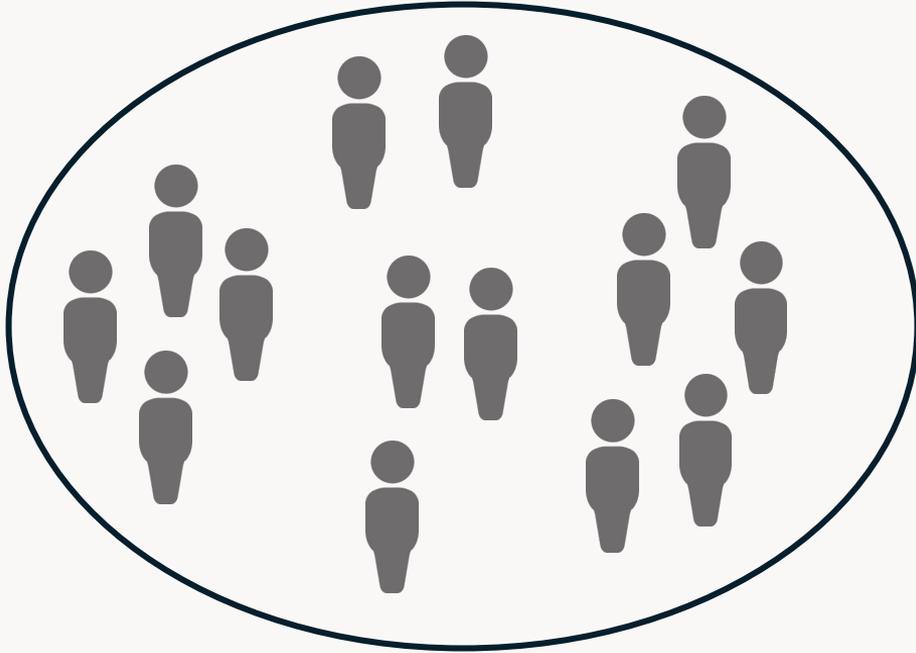
Technical details & pitfalls at <https://epiverse-trace.github.io/posts/s3-generic/>



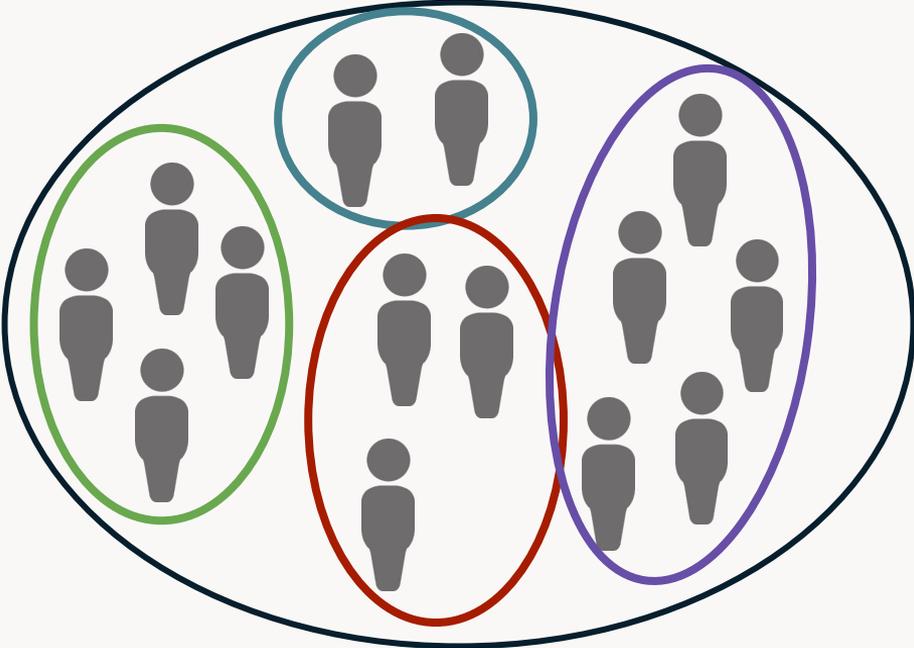
# Examples & reception

**Social contact data**

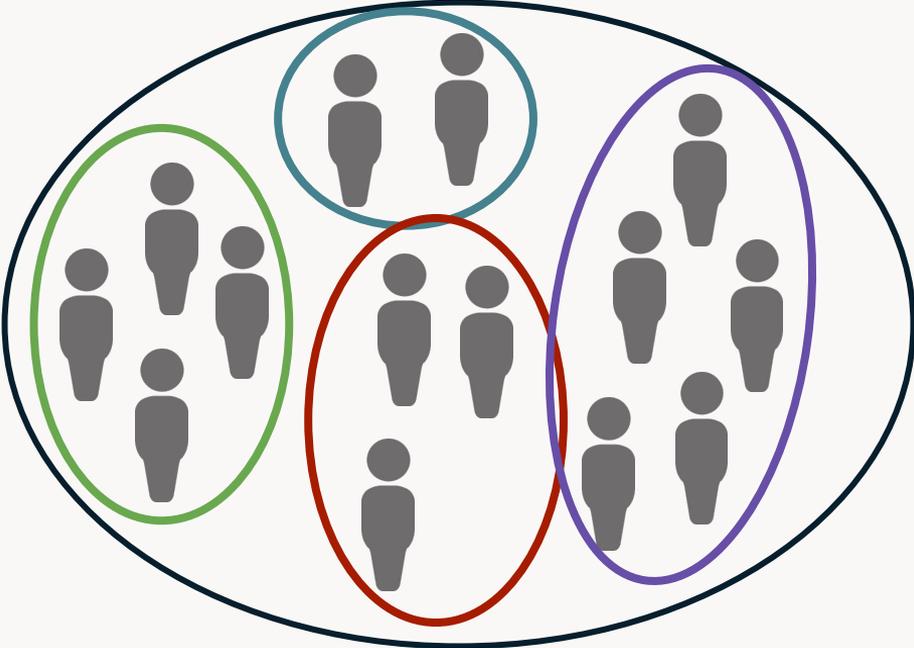
## Social contact data



**Social contact data**

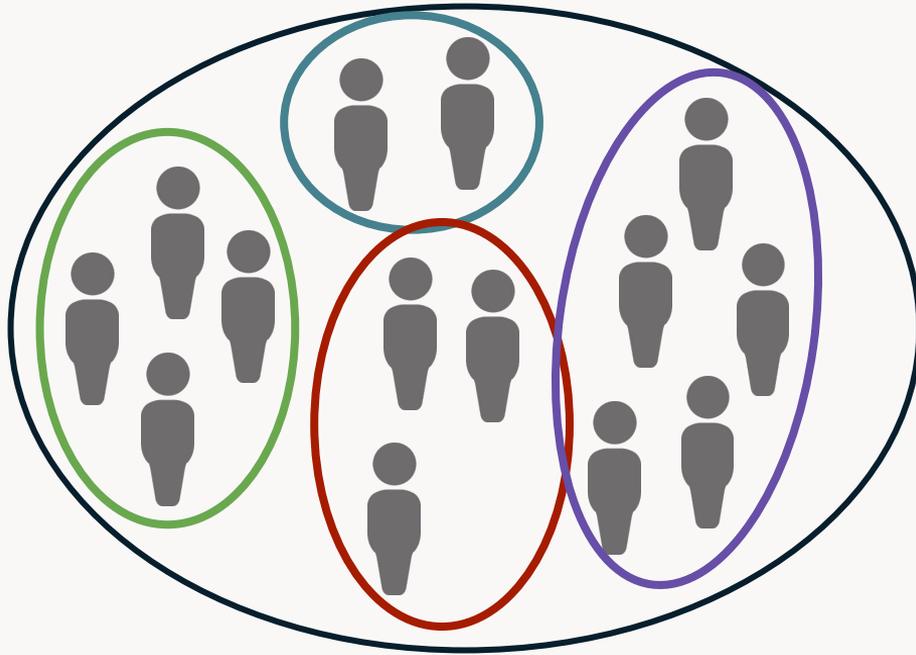


**Social contact data**



Quantify contact between groups

## Social contact data



Quantify contact between groups

Used in mathematical modelling

## Social contact data R packages

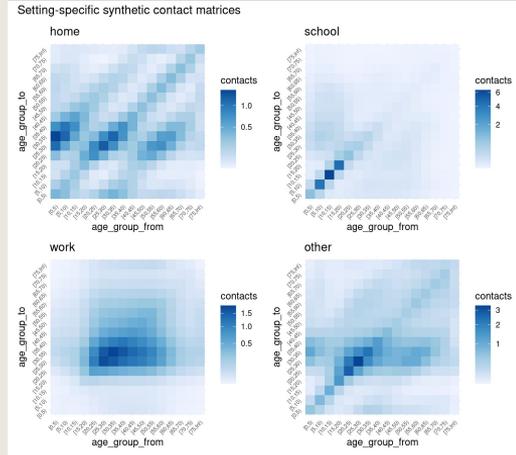
conmat

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# Social contact data R packages

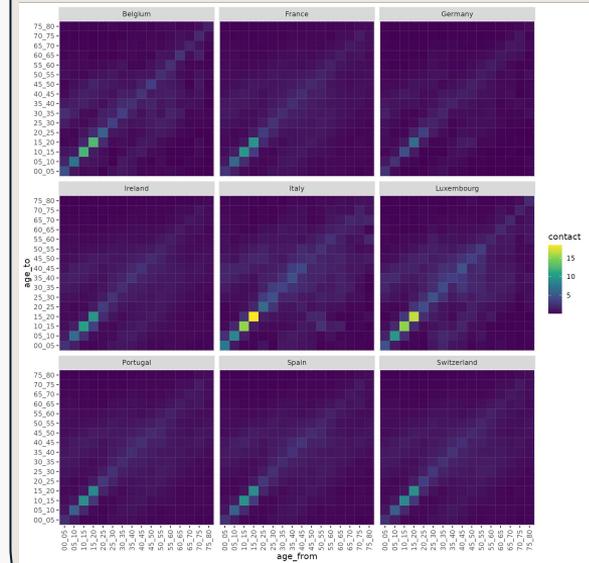
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Shared cm class:

- plotting method
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Downstream tools interact with the same class of object, no matter the exact method they use

# Conclusion

## Problem statement

- Interoperability is hard, and seldomly encouraged
- Non-interoperable ecosystems generate frustration for users and duplicated developer efforts
- Some technical challenges but mostly a human problem

## Looking to the future

- Think of software as tiny piece of a larger problem
  - Community
  - Interoperability
  - Sustainability
- Let's collaborate more!
  - Split maintenance load over multiple maintainers
  - More coherent ecosystem for users
  - Fun!

## Epiverse-TRACE Development Team

### LSHTM / MRCG / UKHSA

- James Azam
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- Roz Eggo
- Sebastian Funk
- Pratik Gupte
- Adam Kucharski
- Joshua Lambert
- Edwin Van Leeuwen
- Karim Mané
- Tim Russell
- Carmen Tamayo
- Tim Taylor
- Andree Valle

LONDON  
SCHOOL of  
HYGIENE  
& TROPICAL  
MEDICINE



UK Health  
Security  
Agency



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- Juan Daniel Umaña

Universidad de  
**los Andes**  
Colombia



# Questions / Feedback?

**Epiverse-TRACE**



epiverse-trace



<https://data.org/initiatives/epiverse>

**Hugo Gruson**



bisaloo



<https://hugogruson.fr>