



Virtual Training 12 - Focus on the Agents of Whooping Cough

# Global Spatial Dynamics and Vaccine-Induced Fitness Changes in *B. pertussis*

November 2024

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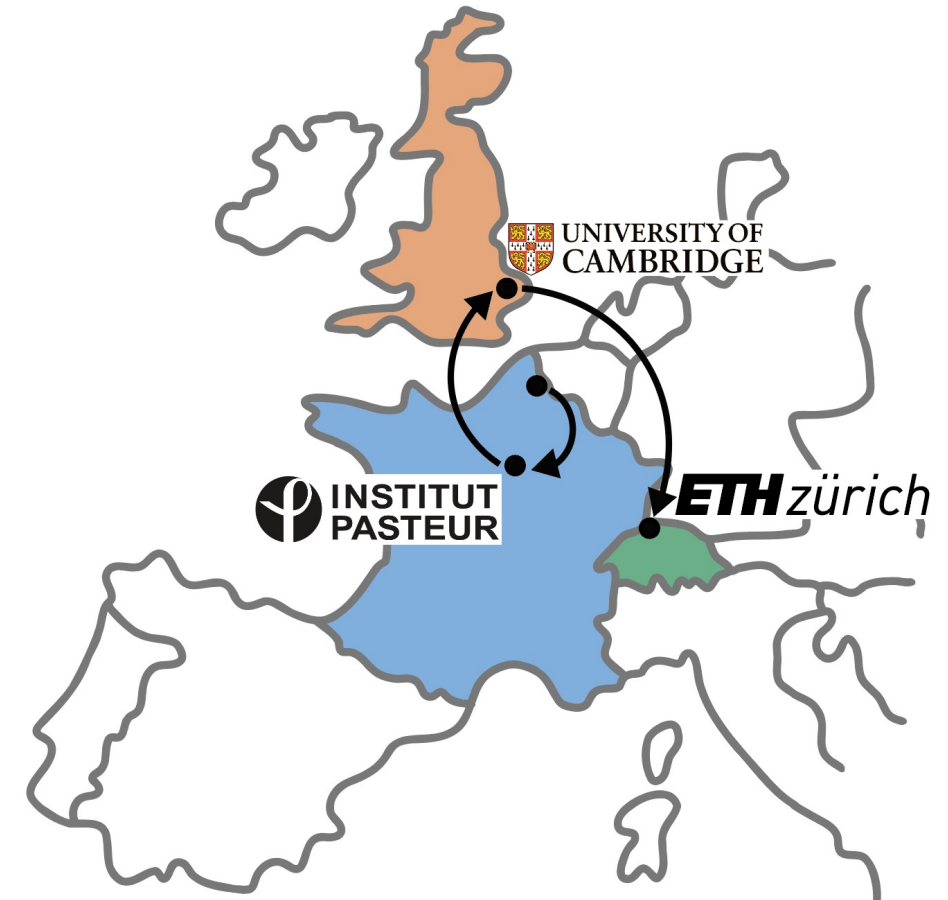
# Noémie Lefrancq

## Background:

- Undergraduate in Biology
- Master in Mathematics of Modelling
- PhD at the University of Cambridge in Infectious disease modelling

Worked at Institut Pasteur Paris

Currently: Postdoctoral fellow at ETH  
Zürich, Switzerland



# Intended Learning Objectives

Specific objectives of this session:

1. Learn about **spatial dynamics** of *Bordetella pertussis*
2. Learn about the **fitness changes** of *Bordetella pertussis* and relation with vaccine types

# Outline

This session consists of the following elements:

Introduction to the session

## **Part I: Global spatial spread of *B. pertussis***

1.1. *B. pertussis* clustering within locations

1.2. Spatial spread of *B. pertussis* within countries and across continents

## **Part II: Vaccine-Induced Fitness Changes in *B. pertussis***

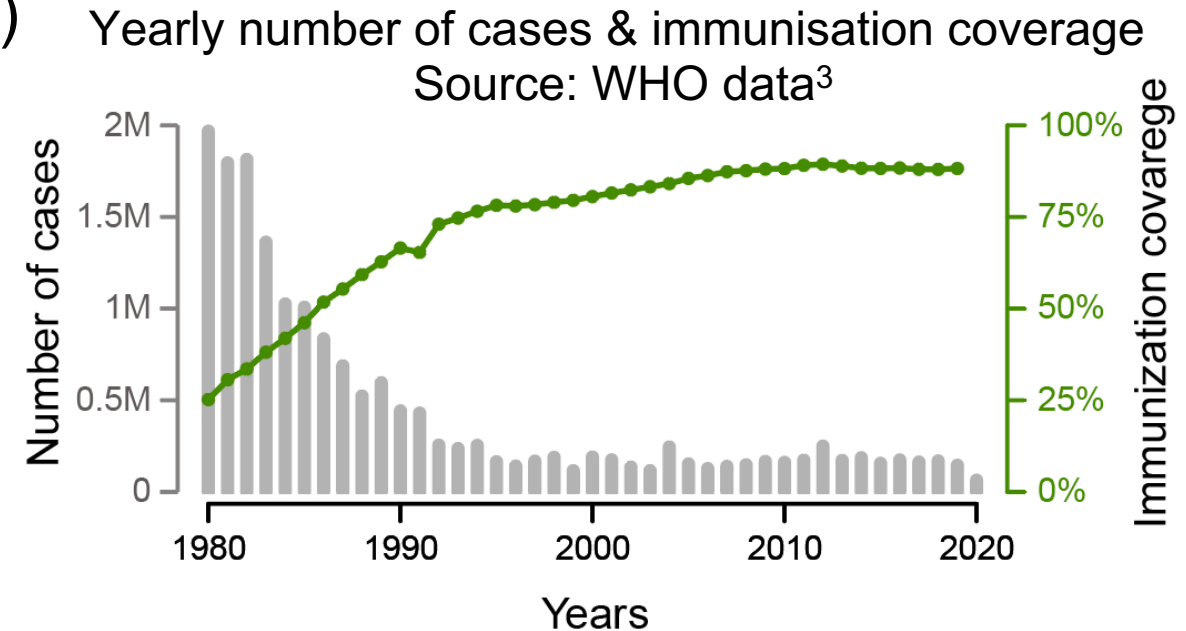
2.1. Methods to estimate changes in fitness

2.2. Impact of vaccine type change on Bp genotypes' fitness

# Introduction

## ***B. pertussis* global epidemiology**

- Incidence greatly reduced since 1980s.
- Vaccination levels are typically high (>90%)
- However, persistent transmission is still observed<sup>1</sup>.
- Reasons for persistence are still unclear<sup>2</sup>
  - Pathogen adaptation?
  - Acellular vaccines waning and asymptomatic carriage?



# Country-specific situation



**Historical vaccine:**  
Whole-cell (WCV)



**Recent vaccine:**  
Acellular (ACV),  
containing:

- Pertussis toxin (PT)
- Fimbria 2 & 3 (fim2 & 3)
- Pertactin (PRN)
- Filamentous Haemagglutinin (FHA)

- Persistent transmission observed<sup>3</sup> in all countries.
- Different vaccines exist.

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**Do you think pertussis is mostly endemic, or spreads across locations?**

① Start presenting to display the poll results on this slide.

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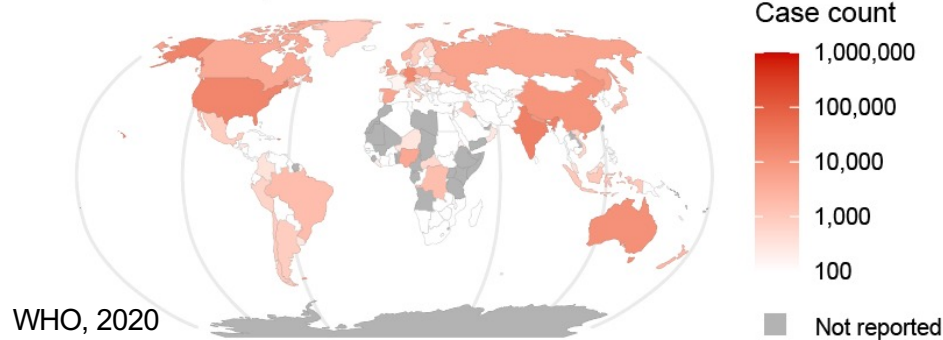


**What type of pertussis vaccine  
is implemented in your country?**

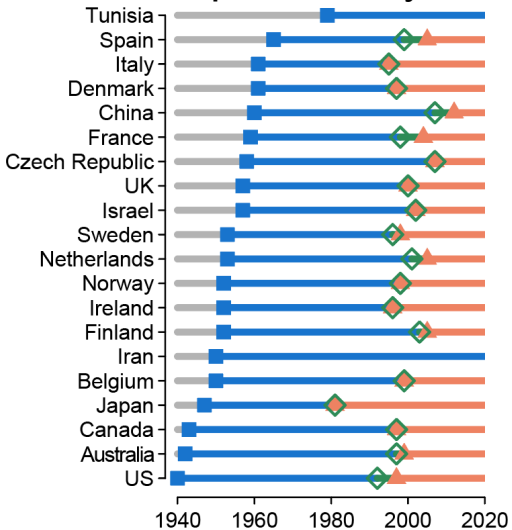
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# Country-specific situation

Reported cases in 2017



Vaccine introductions per country<sup>4</sup>



**Historical vaccine:**  
Whole-cell (WCV)

**Recent vaccine:**  
Acellular (ACV), containing:

- Pertussis toxin (PT)
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- Persistent transmission observed<sup>3</sup>.

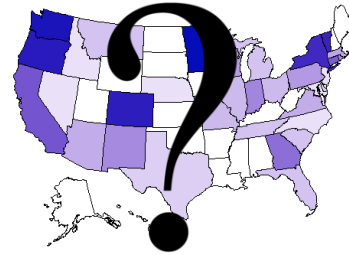
How fast is Pertussis spreading across spatial scales?

- Heterogeneity in timing of introductions and vaccine types.

How are vaccines impacting Pertussis strains at the population level?

# Key questions

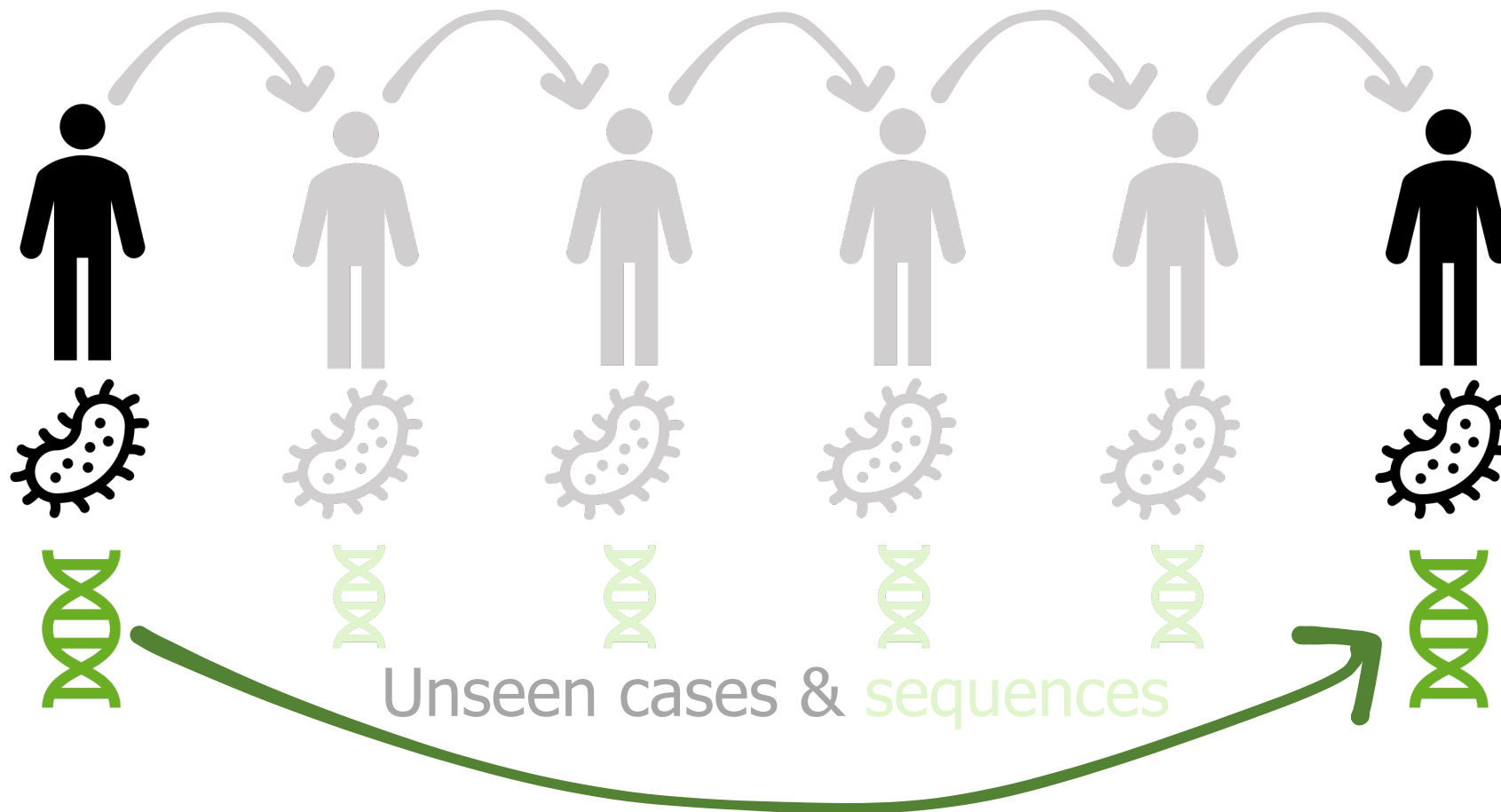
Part 1: How fast is Pertussis spreading across spatial scales?



Part 2: How are vaccines impacting circulating strains?



# Genetic epidemiology can help



# Genetic epidemiology can help

By combining information of:



where people live



when they get sick



the bacterial genomes

- ▶ We can answer these key questions on pertussis circulation

# Global genomics project

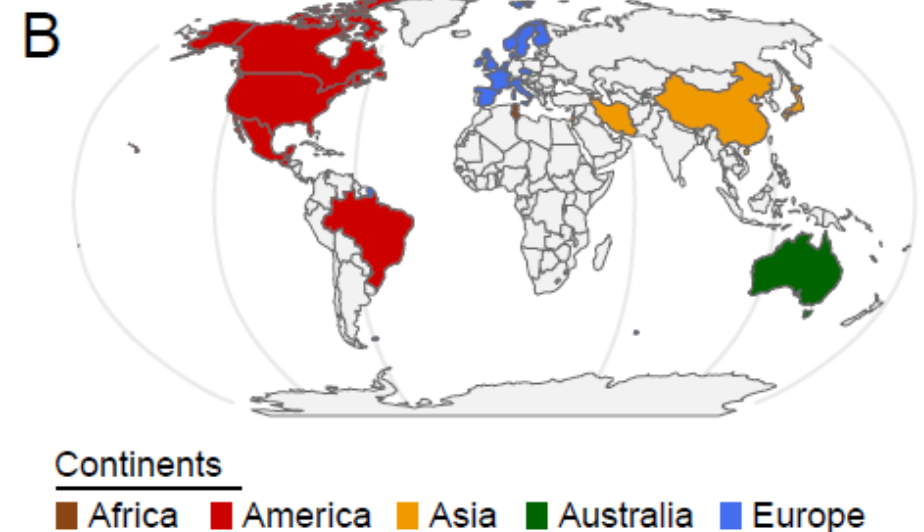
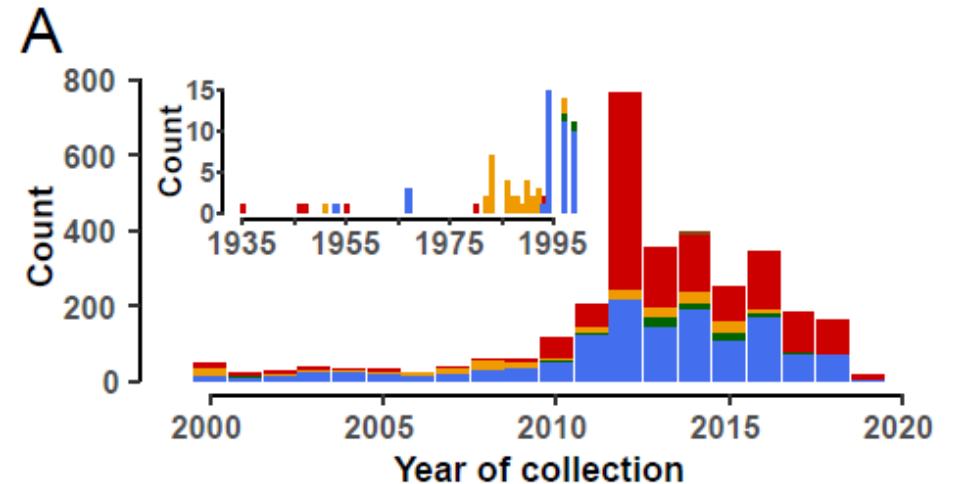
Joint work with Institut Pasteur Paris

**3343 whole genomes from 1935 to 2019, from 23 countries:**

- **1012 from France**
- **320 sequences from Europe:** Belgium, Czech Republic, Denmark, Spain, Finland, Italy, Ireland, The Netherlands, Norway, Sweden and The UK.
- **2012 from GenBank**

For each isolate, we have:

- **Date** of sampling (year)
- **Location** of sampling

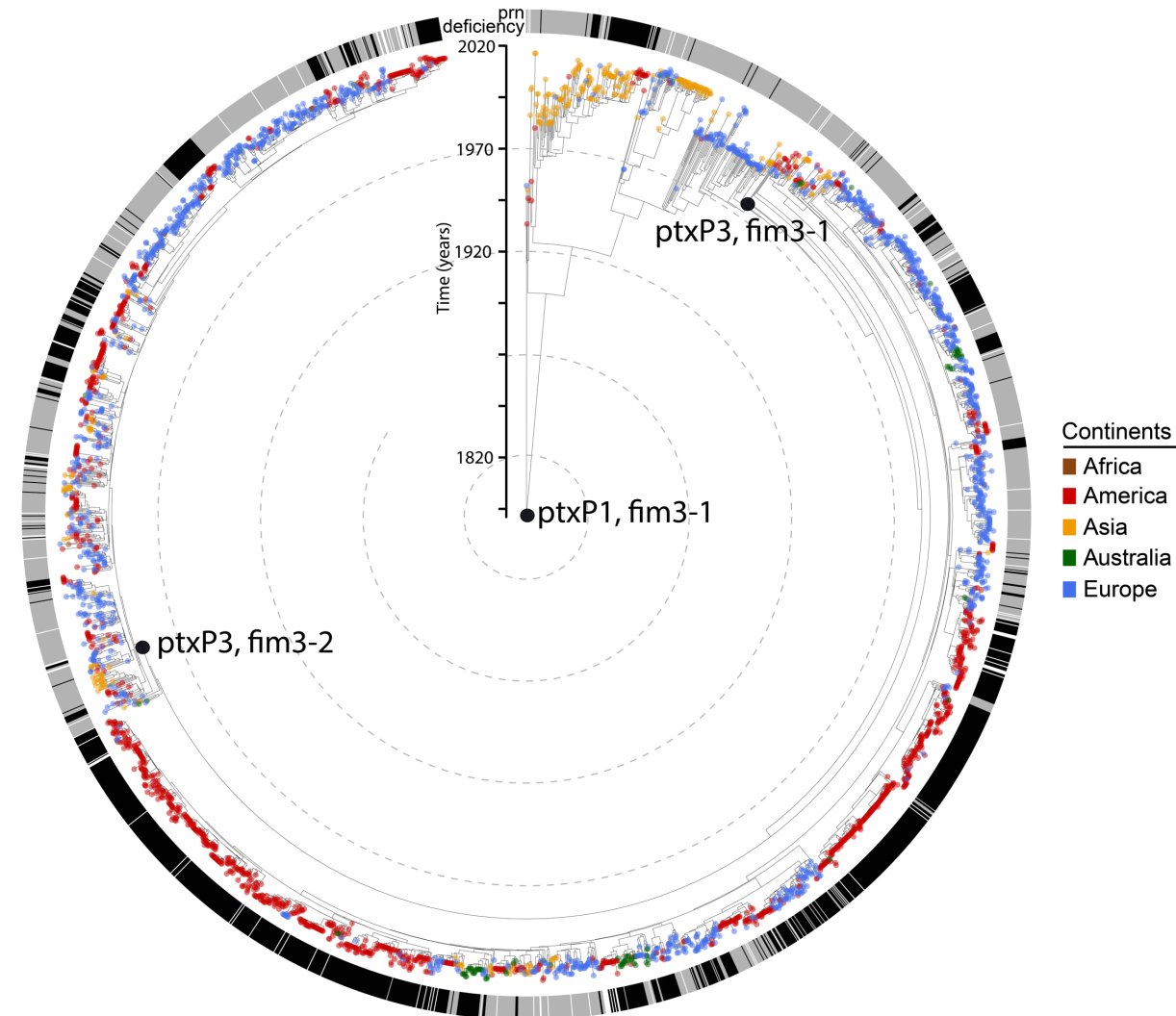


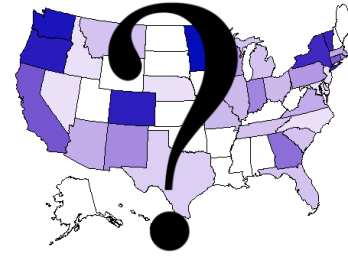
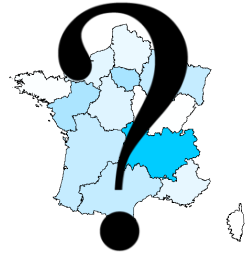
# Timed-tree reconstruction

- We used genome-wide single nucleotide polymorphism variation (SNPs) to reconstruct tree with BEAST.

## Initial observations

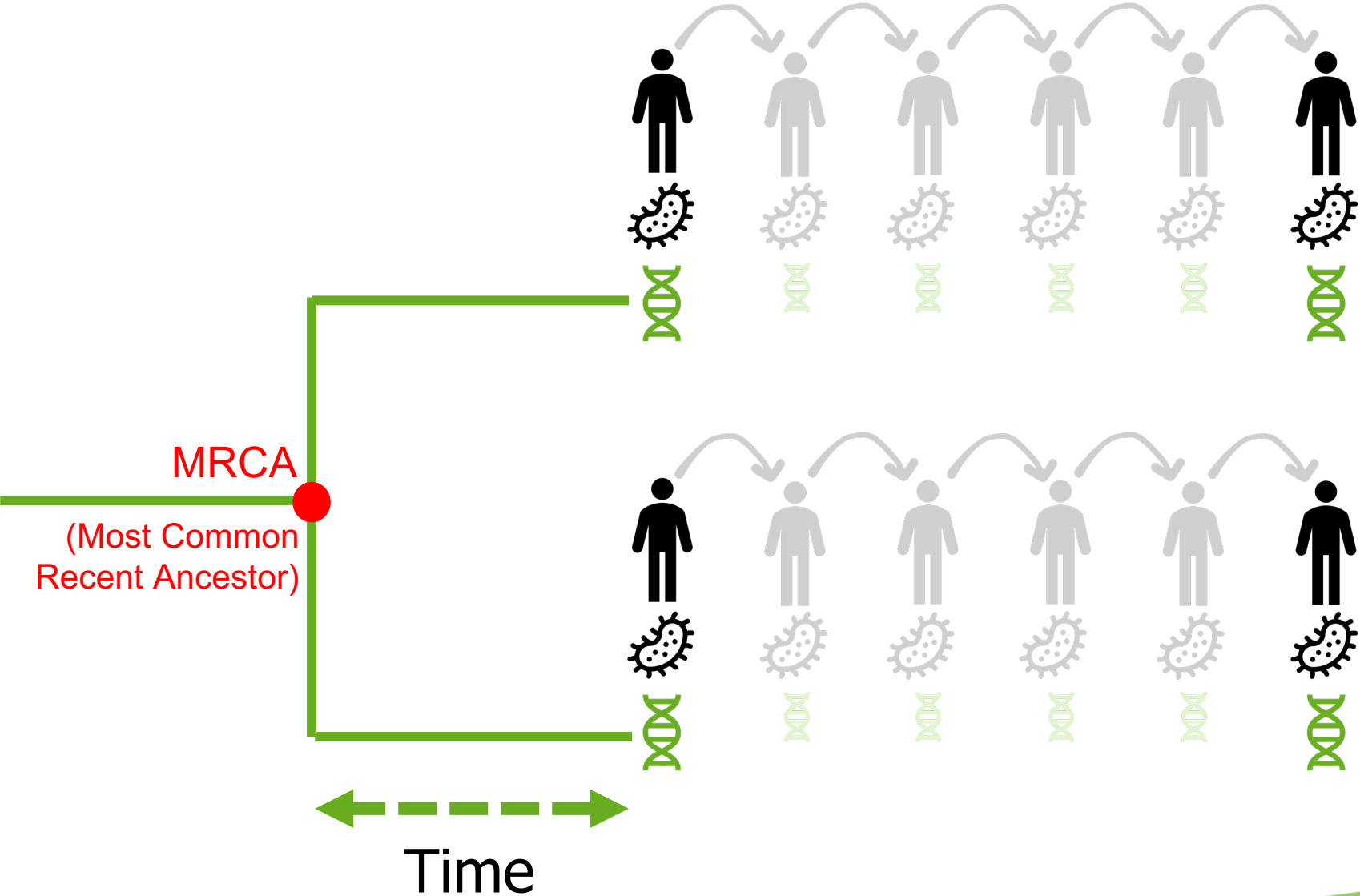
- ▶ Little diversity, only a few key changes
- ▶ Lots of mixing across continents
- ▶ **However, looking at trees can only tell us so much:**
  - ▶ **Not quantitative descriptions**
  - ▶ **Biased by when and where sequences were isolated**



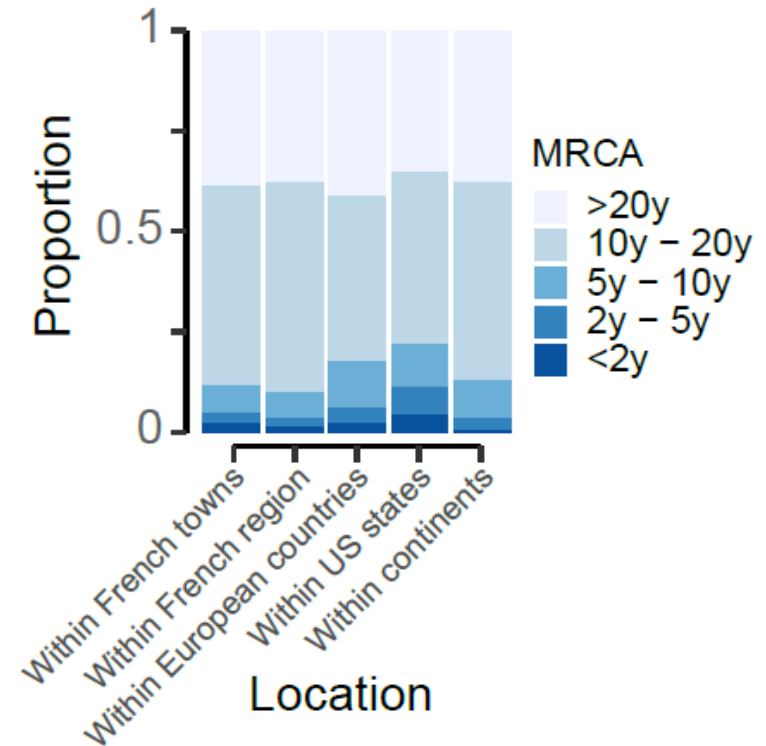
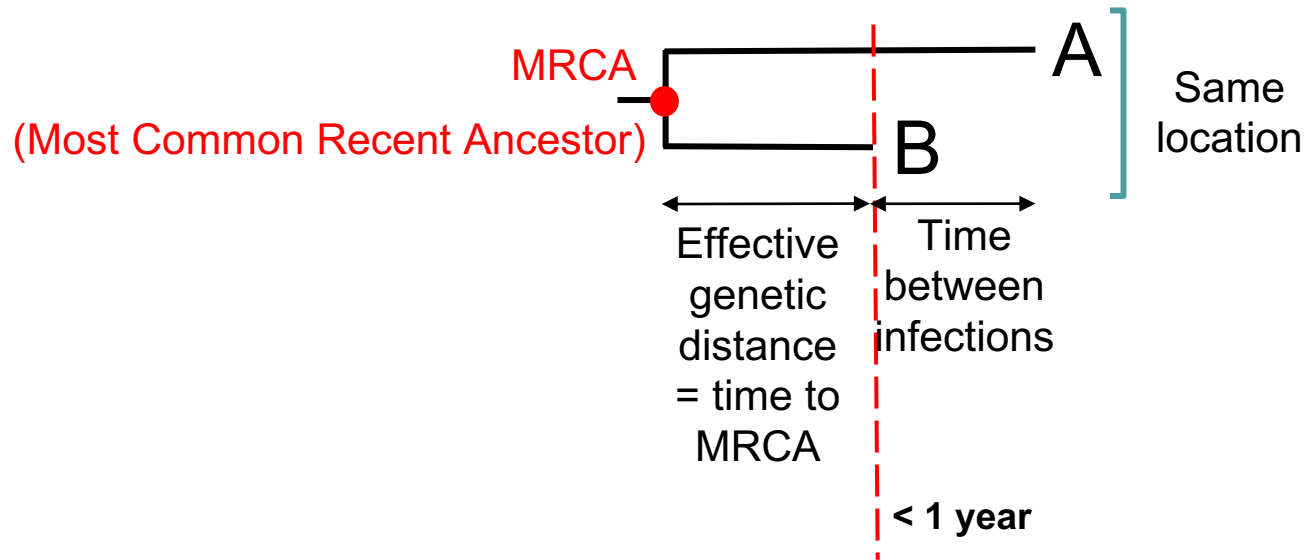


# Part I: Global spatial spread of *B. pertussis*

# B. pertussis clustering within locations

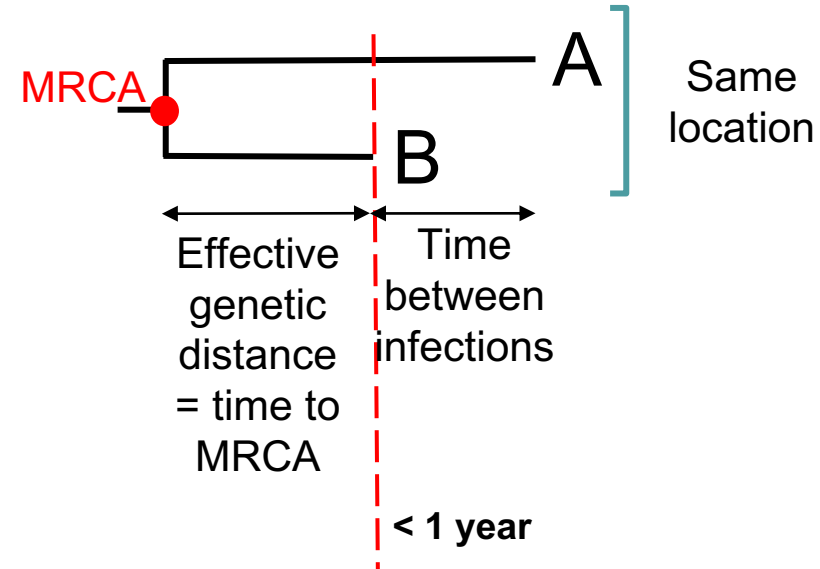


# *B. pertussis* clustering within locations

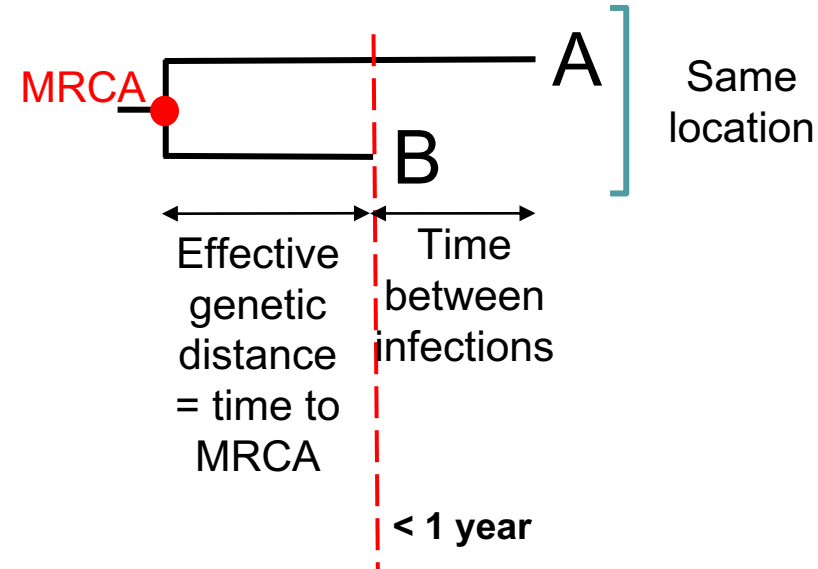


- ▶ Only 1-2% of pairs of cases from the same location and infected within the same year had closely related sequences (MRCA<2y).
- ▶ **Strong evidence that there are many independent co-circulating transmission chains consistent with a long-term endemic transmission.**

# Investigating spatial spread of *B. pertussis*



# Investigating spatial spread of *B. pertussis*



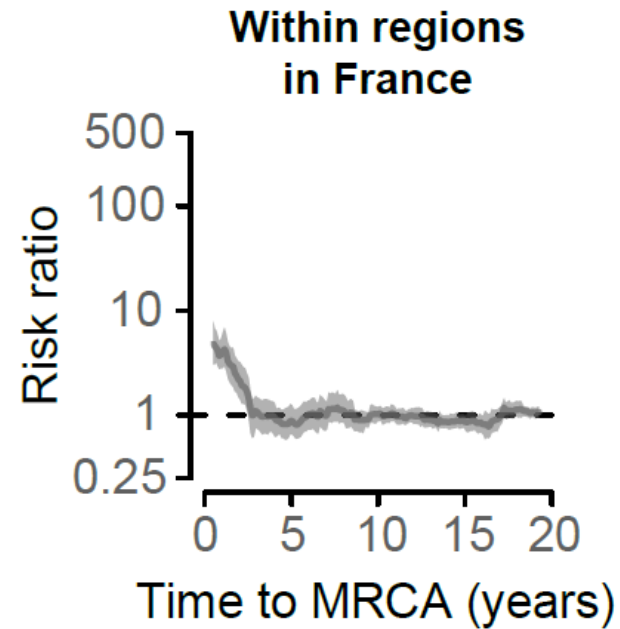
$$P_s = \frac{\# \text{ pairs } \{ \text{MRCA} \in \text{window} \ \& \ \text{same year} \ \& \ \text{given location} \}}{\# \text{ pairs } \{ \text{same year} \ \& \ \text{given location} \}}$$

$$P_{ref} = \frac{\# \text{ pairs } \{ \text{MRCA} \in \text{window} \ \& \ \text{same year} \ \& \ \text{diff location} \}}{\# \text{ pairs } \{ \text{same year} \ \& \ \text{diff location} \}}$$

$$RR = \frac{P_s}{P_{ref}}$$

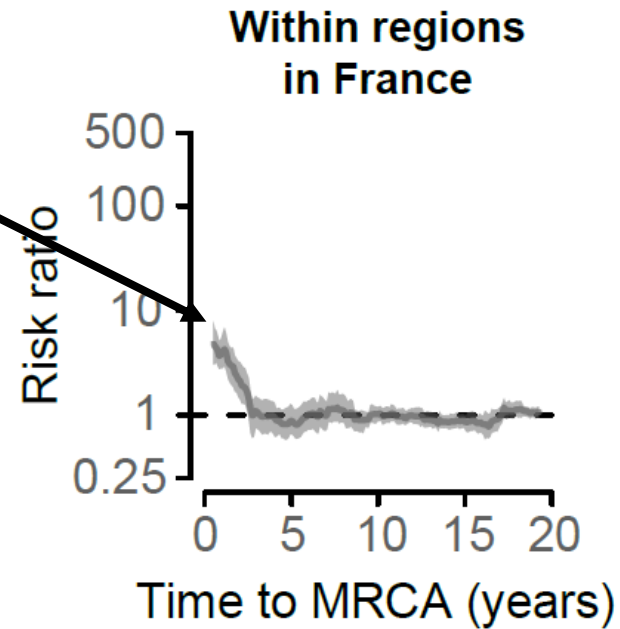
- By conditioning on spatial and temporal location of sequences, this approach **minimizes the impact of underlying sampling biases** with which cases were sequenced.

# Investigating spatial spread of *B. pertussis*

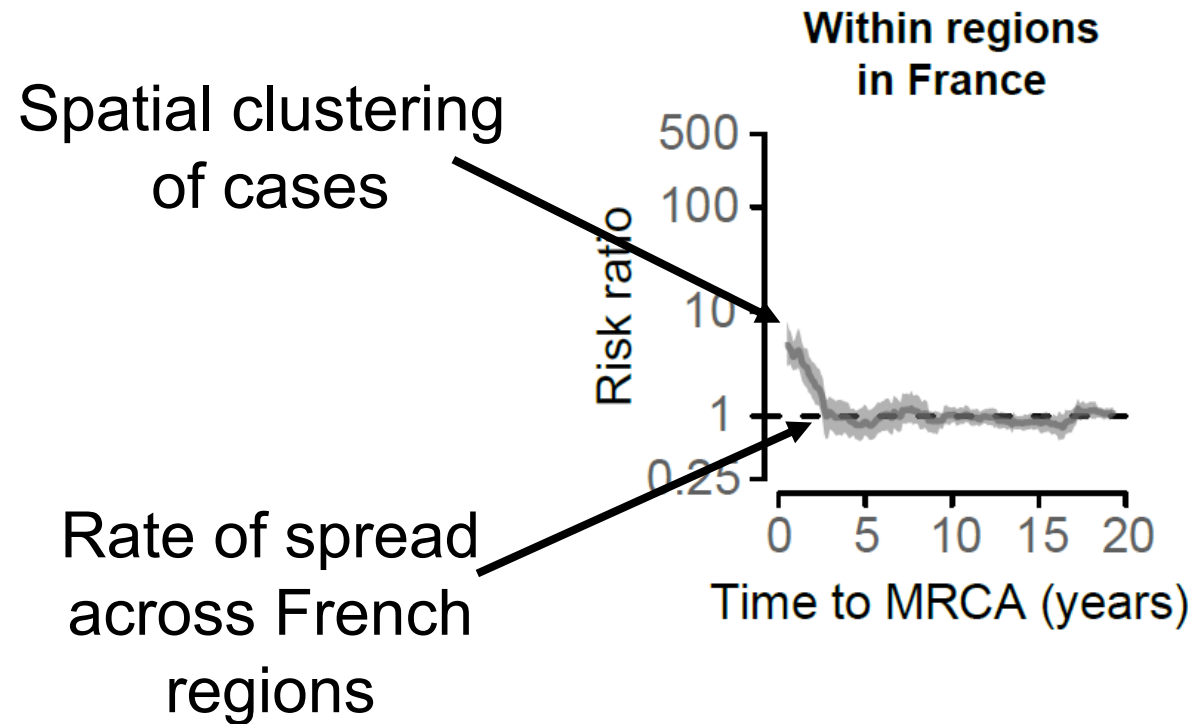


# Investigating spatial spread of *B. pertussis*

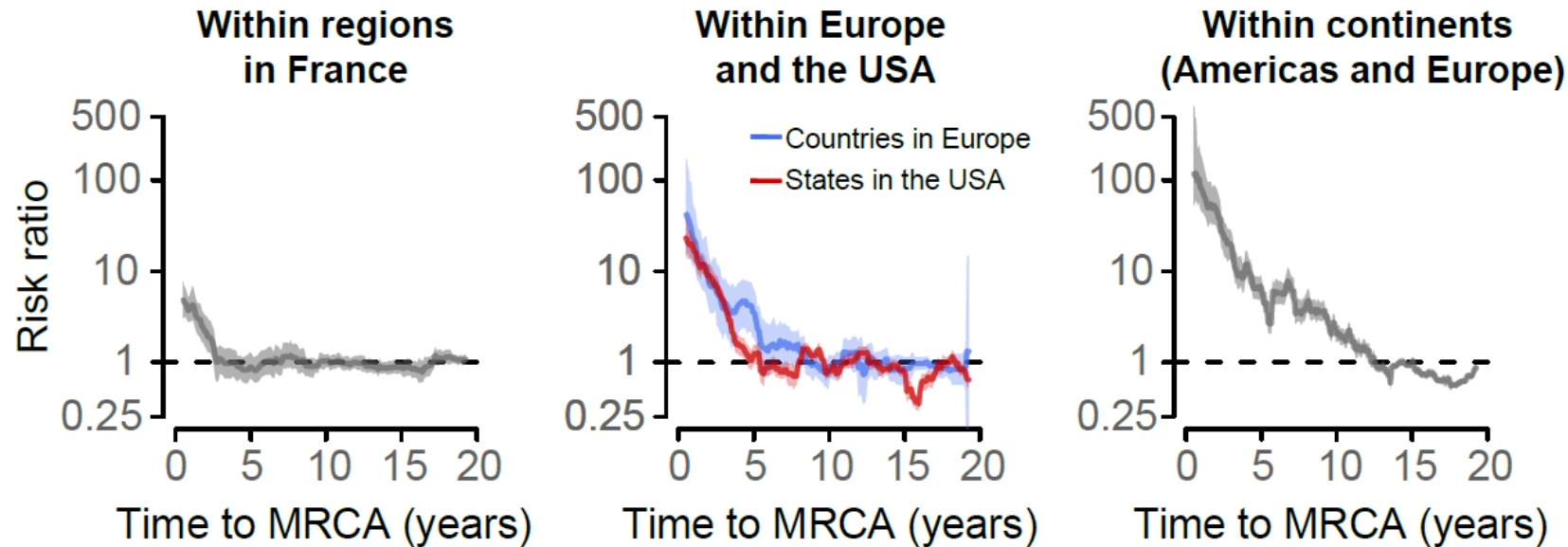
Spatial clustering  
of cases



# Investigating spatial spread of *B. pertussis*



# Investigating spatial spread of *B. pertussis*



- ▶ Clustering within US states is very similar to that observed within European countries.
- ▶ **It takes a few years for *B. pertussis* to be well mixed across France, Europe/US and continents.**

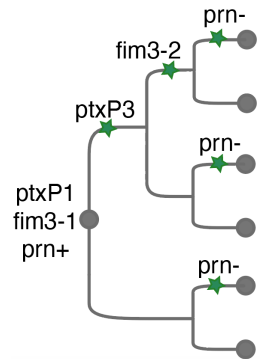
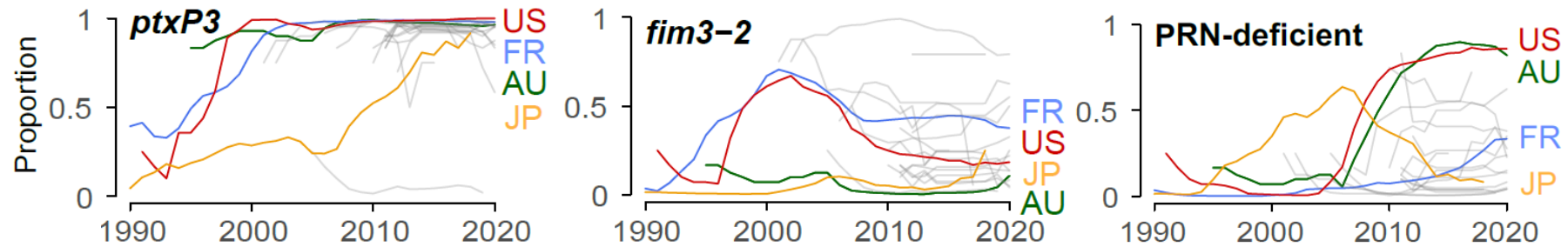
# Questions?



# Part 2: Vaccine-Induced Fitness Changes of *B. pertussis*

# Fitness changes of *B. pertussis* genotypes

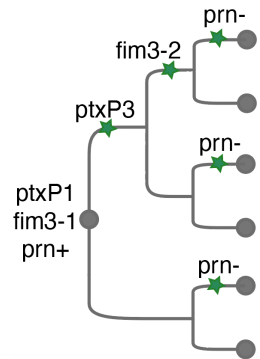
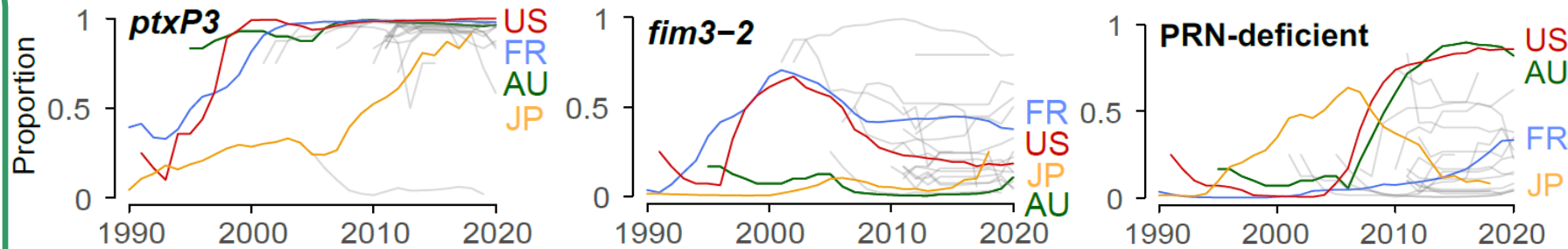
Genotypes based on virulence factors,  
defined by the alleles of *ptxP*, *fim3* and expression of PRN



# Fitness changes of *B. pertussis* genotypes

Genotypes based on virulence factors,  
defined by the alleles of *ptxP*, *fim3* and expression of PRN

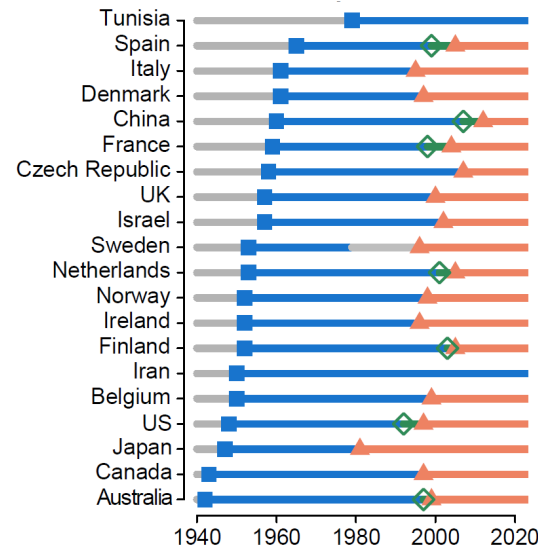
Proportion of strains by country



&



Vaccine implementations in each country



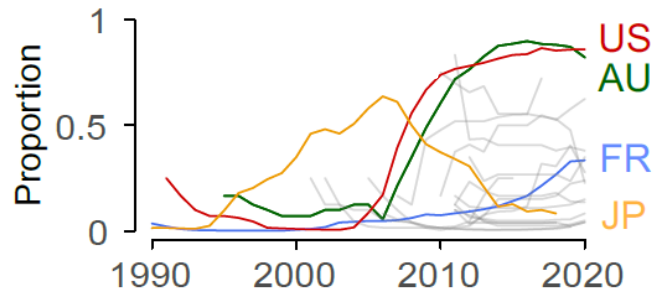
Historical vaccine:  
Whole-cell

Recent vaccine:  
Acellular

# Investigating changes in *B. pertussis* fitness



Proportion of  
strains  
by country



Vaccine  
implementations  
in each country



**Historical vaccine:**  
Whole-cell (WCV)



**Recent vaccine:**  
Acellular (ACV)

- We consider 6 different genotypes, based on the *ptxP*, *fim3* types and *prn* deficiency.

- Fit a logistic model to the relative abundance of each genotype  $i$  with respect to a chosen  $ref$  genotype

$$f_{i,ref}(t) = \frac{1}{1 + \left( \frac{1}{f_{i,ref,0}} - 1 \right) e^{-r_i t}},$$

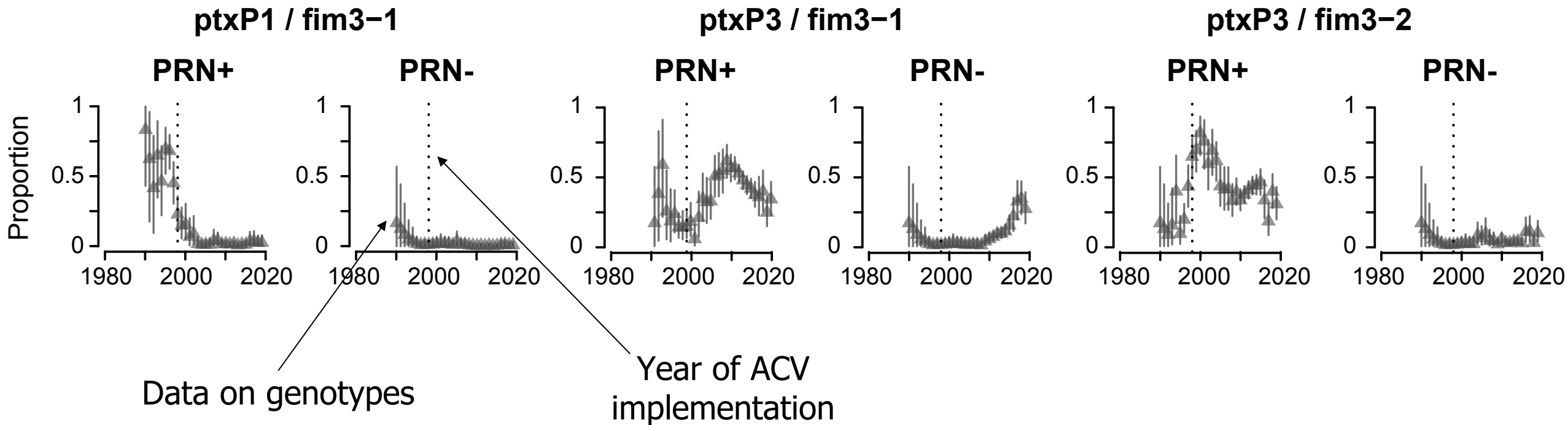
with  $i \in \{genotypes\} \setminus ref$

where  $f_{i,ref,0}$  is the relative abundance of the genotype  $i$  compared to genotype  $ref$  at time 0

- We estimate the fitness advantage of each genotype:
  - ▶ **Same across all countries**
  - ▶ **Independently on the WCV and ACV eras**

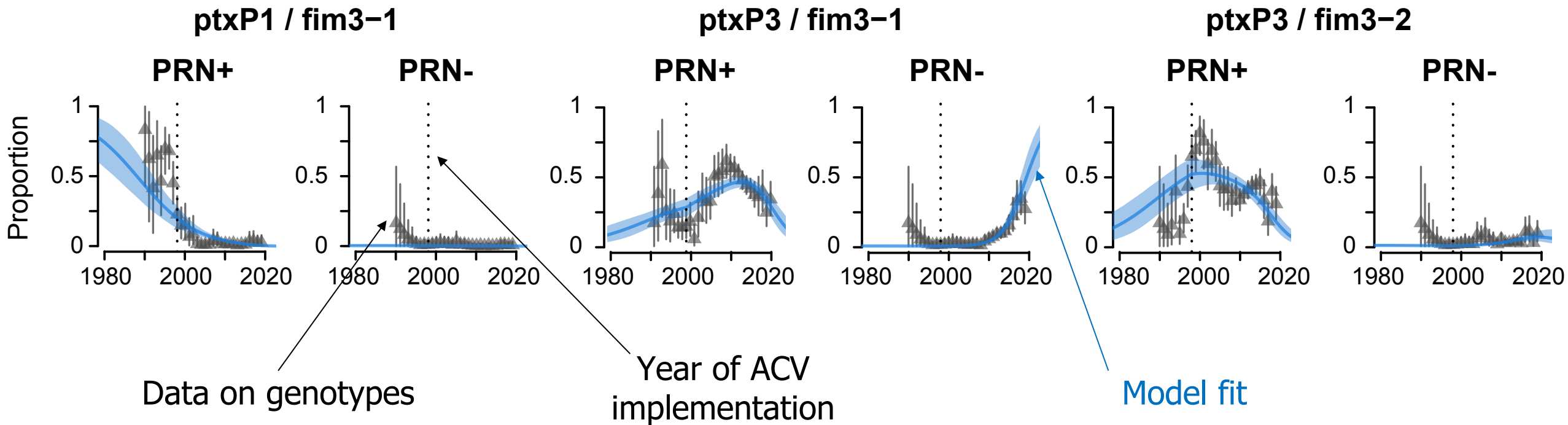
# Example of fits obtained

## France

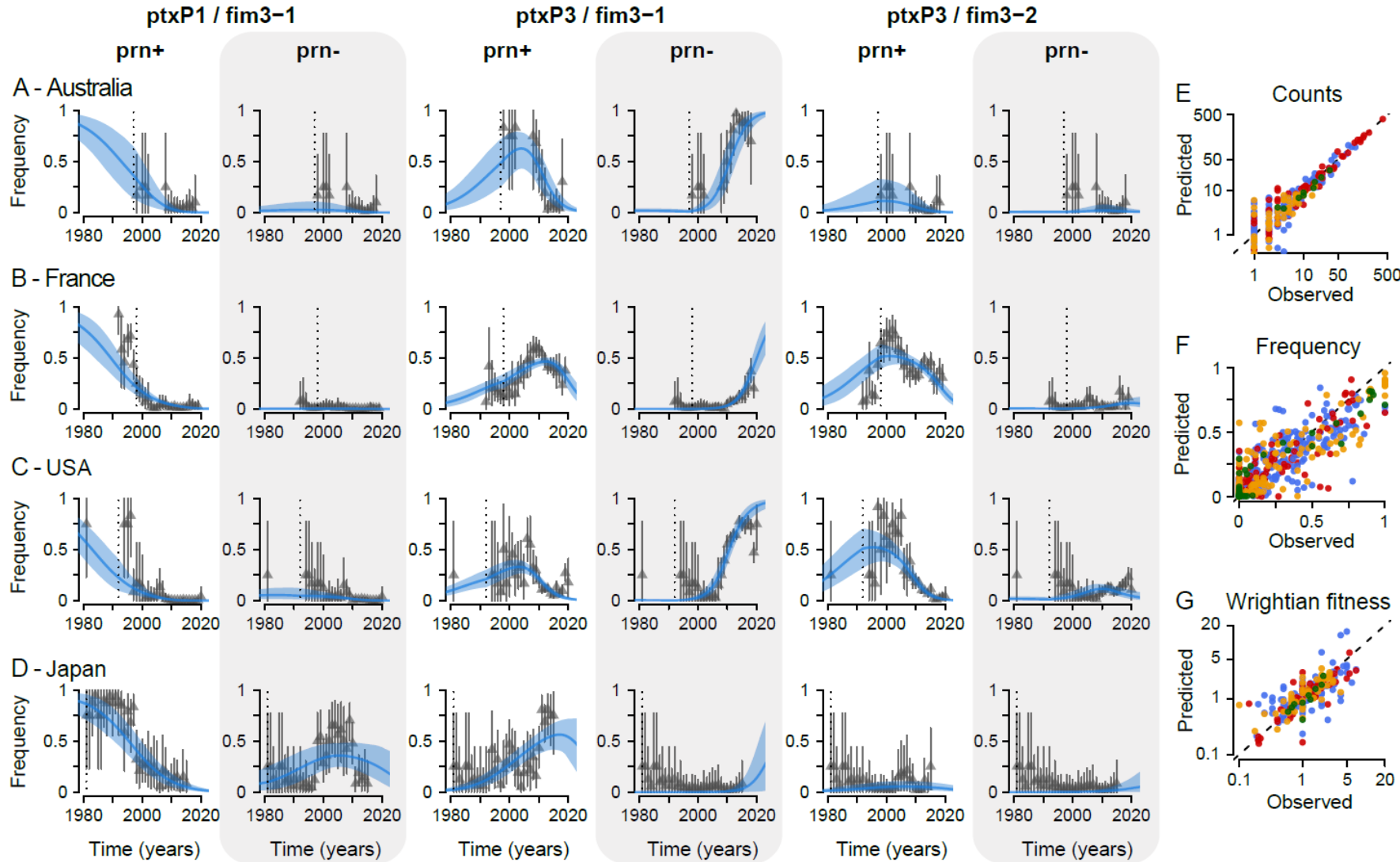


# Example of fits obtained

## France



# Fits obtained across countries

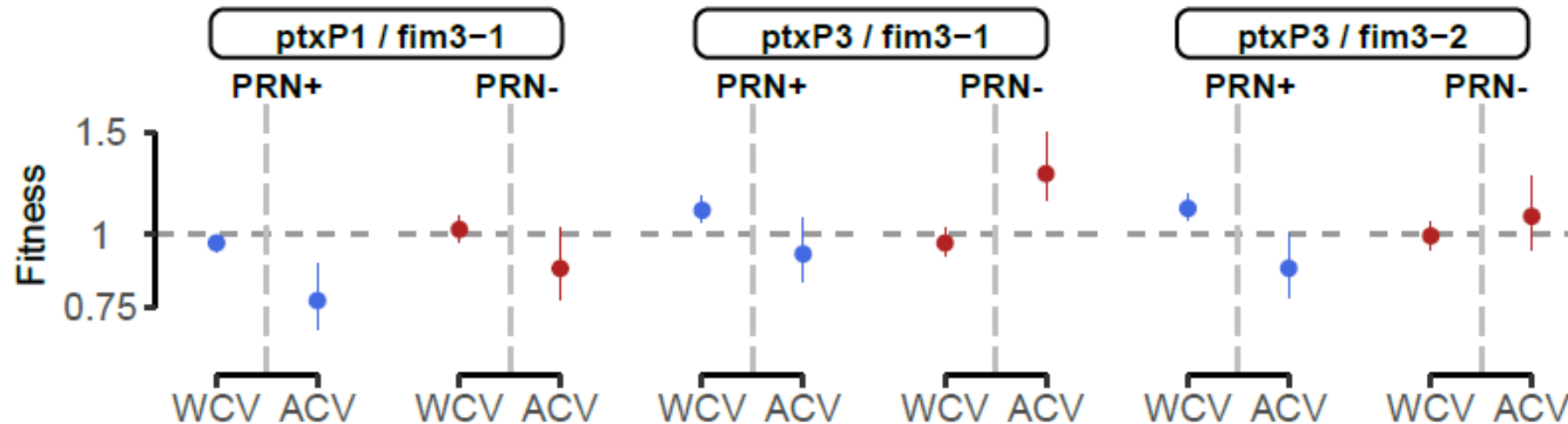


We fit to all 20 countries.

► Our simple model is able to capture the country-specific trends in frequencies.

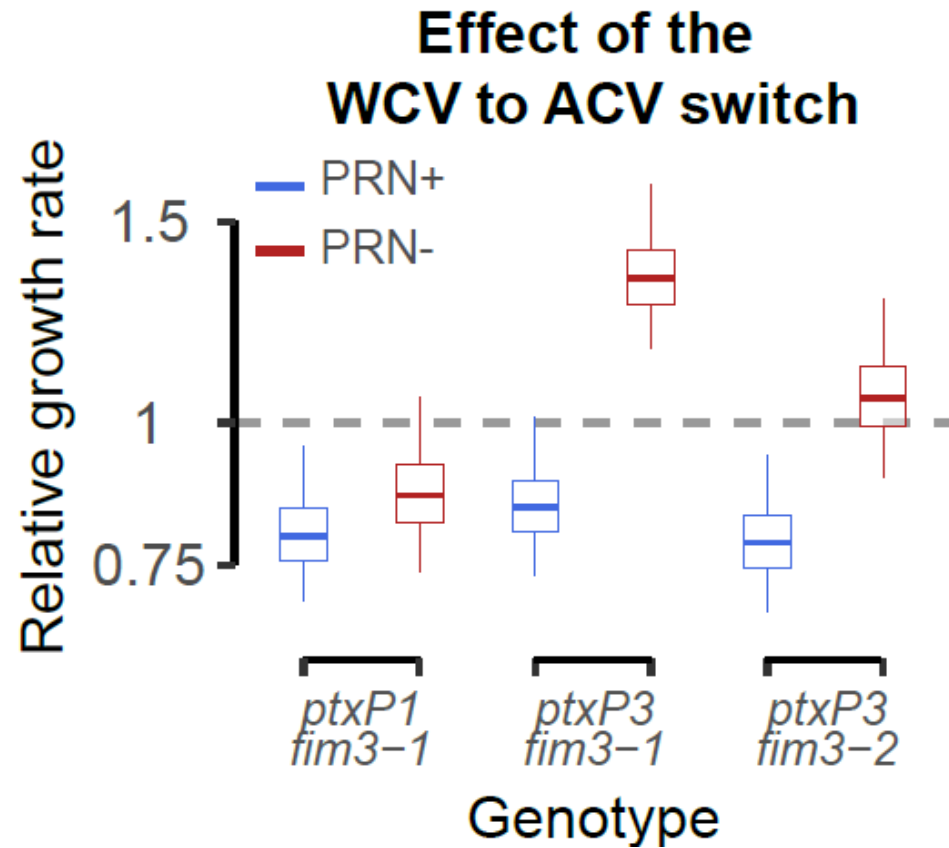
# Fitness estimate of each genotype

Fitness estimates of each genotype



- ▶ The ptxP3/fim3-1/PRN- genotype is the fittest in ACV era.
- ▶ **Vaccine switch (WCV to ACV) is associated with large changes of fitness.**

# Fitness estimate of each genotype



► The PRN-deficient strains are on average 1.1 times more fit after the vaccine switch.

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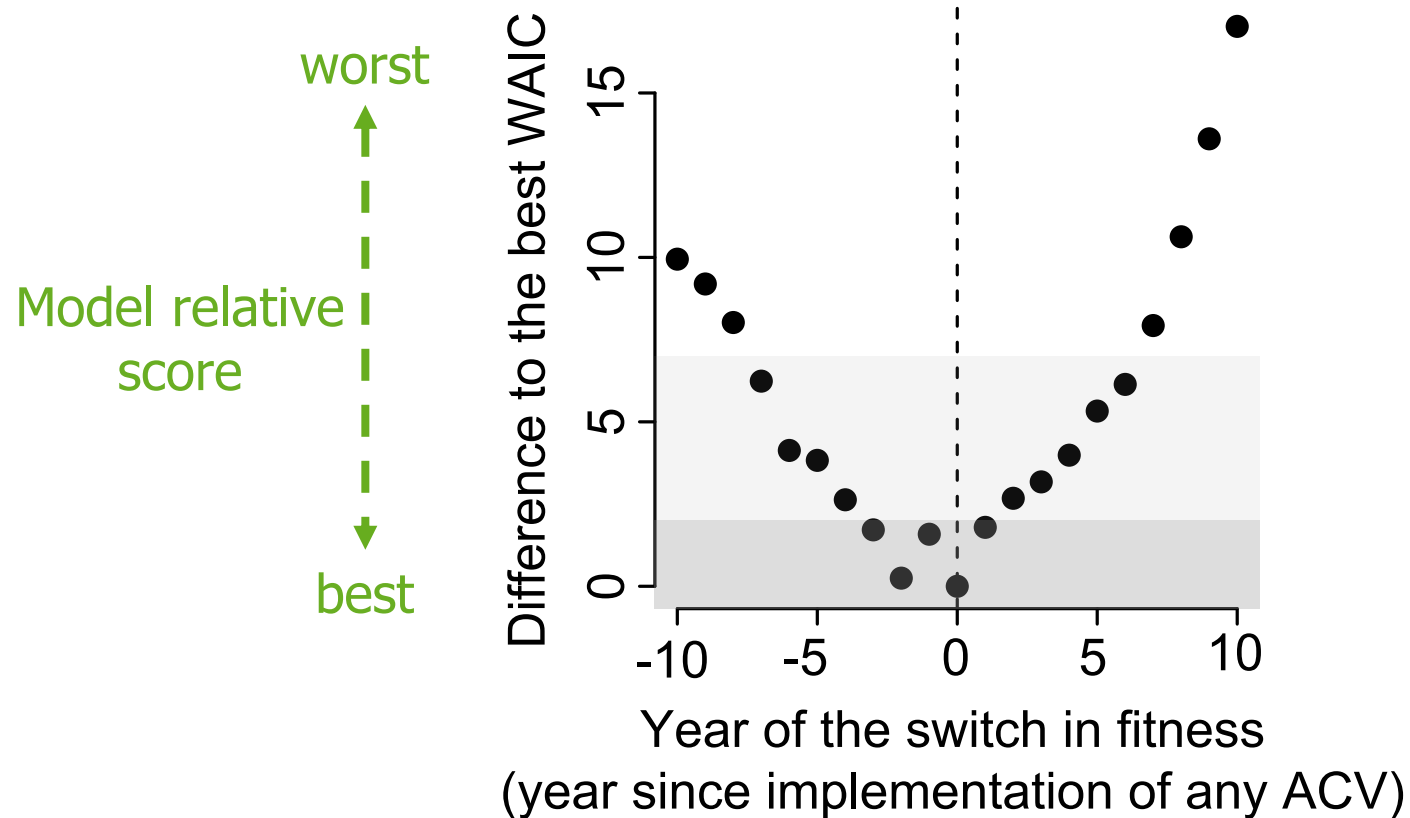


**How long does it take for the vaccine switch to induce a fitness change?**

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# Time it takes for the vaccine to change selection pressure

Model comparison to test different delays between vaccine implementation and change in fitness



# In summary

List of learning points in this session:

## **Part I: Global spatial dynamics of *Bordetella pertussis***

Evidence of many independent co-circulating transmission chains within locations, consistent with a long-term endemic transmission.

*Bp* spreads both nationally and internationally in just a few years.

## **Part II: fitness of the different genotypes, and the effect of vaccine types**

Genotypes have largely different fitness.

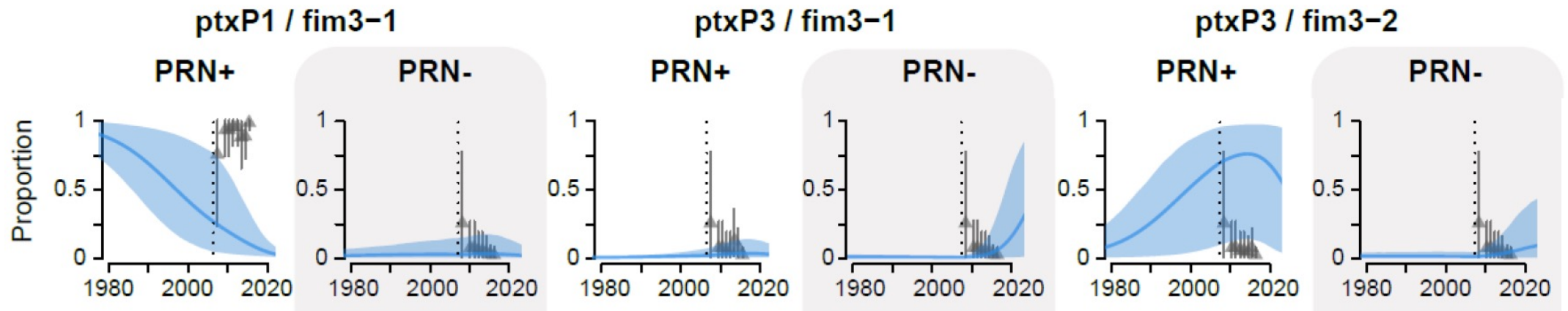
The implementation of ACV is associated with a fitness shift, especially of prn-deficient genotypes.

All in all, it suggests that **future work** needs to **reconcile the rapid spread** between countries **with the history of vaccination** to better understand maintenance of *B. pertussis*.

# Limitations & perspectives

**Biased sampling:** sequences mostly from High Income Countries.

**Unexplained dynamics:** we cannot explain the dynamics in China.



**Only 6 genotypes considered:** we might be missing the true underlying causal variants.

**Effect of the SARS-CoV-2 pandemic?** This study was done on isolates up to 2019, but social distancing measures have had an effect on *Bp* spread and strain diversity.

**Thank you for your attention!**

**Questions?**

# Further reading

More on this study (article): [N. Lefrancq & V. Bouchez, \*et al.\* Global spatial dynamics and vaccine-induced fitness changes of \*Bordetella pertussis\*. \*Sci. Transl. Med.\* \(2022\)](#)

More on *B. pertussis* epidemiology and evolution (book): [Rohani, Pejman, and Samuel Scarpino \(eds\), \*Pertussis: Epidemiology, Immunology, and Evolution\* \(Oxford, 2018\)](#)

More on general modelling infectious diseases (book): [Keeling, Matt J., and Pejman Rohani. \*Modeling Infectious Diseases in Humans and Animals\*. Princeton University Press \(2008\)](#)

# References



- 1: K. H. T. Yeung, P. Duclos, E. A. S. Nelson, R. C. W. Hutubessy, An update of the global burden of pertussis in children younger than 5 years: A modelling study. *Lancet Infect. Dis.* 17, 974–980 (2017).
- 2: D. W. Jackson, P. Rohani, Perplexities of pertussis: Recent global epidemiological trends and their potential causes. *Epidemiol. Infect.* 142, 672–684 (2014).
- 3: WHO, Diphtheria tetanus toxoid and pertussis (DTP3) - [Immunization coverage estimates by country](#)
- 4: N. Lefrancq, V. Bouchez, N. Fernandes, A.-M. Barkoff, T. Bosch, T. Dalby, T. Åkerlund, J. Darenberg, K. Fabianova, D. F. Vestrheim, N. K. Fry, J. J. González-López, K. Gullsby, A. Habington, Q. He, D. Litt, H. Martini, D. Piérard, P. Stefanelli, M. Stegger, J. Zavadilova, N. Armatys, A. Landier, S. Guillot, S. L. Hong, P. Lemey, J. Parkhill, J. Toubiana, S. Cauchemez, H. Salje, S. Brisse, Global spatial dynamics and vaccine-induced fitness changes of *Bordetella pertussis*. *Sci. Transl. Med.* 14, eabn3253 (2022).
- 5: H. Salje, D. A. T. Cummings, I. Rodriguez-Barraquer, L. C. Katzelnick, J. Lessler, C. Klungthong, B. Thaisomboonsuk, A. Nisalak, A. Weg, D. Ellison, L. Macareo, I.-K. Yoon, R. Jarman, S. Thomas, A. L. Rothman, T. Endy, S. Cauchemez, Reconstruction of antibody dynamics and infection histories to evaluate dengue risk. *Nature* 557, 719–723 (2018).

# Acknowledgements

The creation of this training material was commissioned by ECDC to Institut Pasteur with the direct involvement of Noémie Lefrancq.