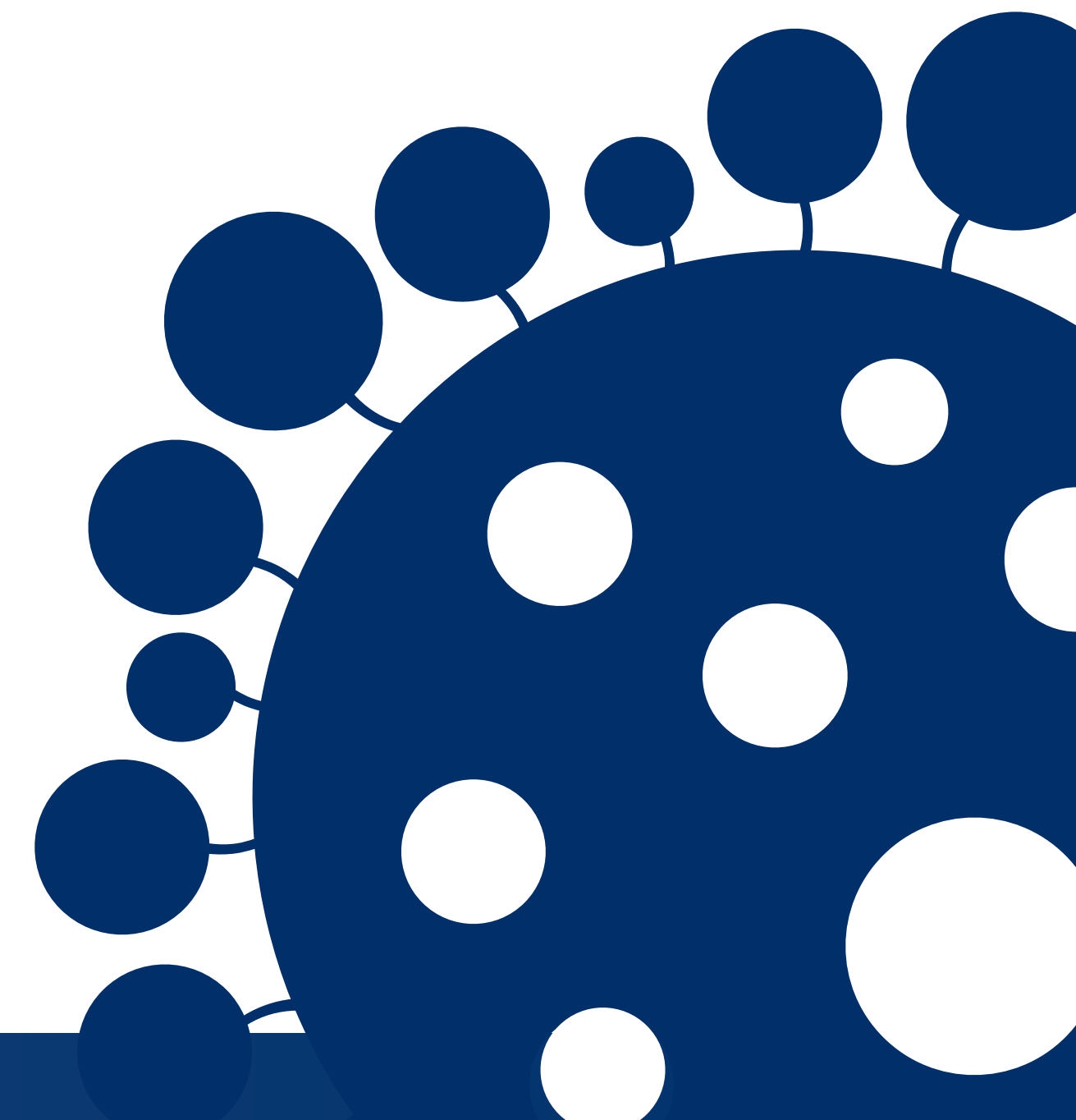


Dengue in the urban environment

What role can modelling and analytics play in our public health response?

Alex R Cook Associate Professor Vice Dean (Research)



Dengue epidemiology 101

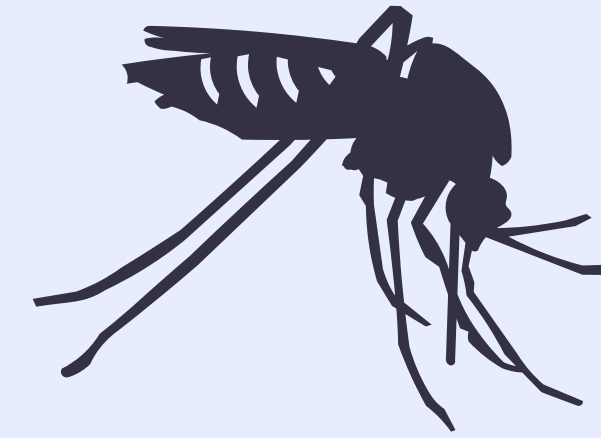


Aedes aegypti

Friendly, loves people
(ie Anthropophilic)

Adapted to urban environment
Lives around our homes

Highly competent dengue
vector



Aedes albopictus

Loves green areas, gets along
with all animals

Generally less frequent around
homes

Less competent dengue vector



How can modelling and analytics contribute?

Problem 1: forecasting



24

°C | °F

Precipitation: 57%

Humidity: 94%

Wind: 11 km/h

Singapore

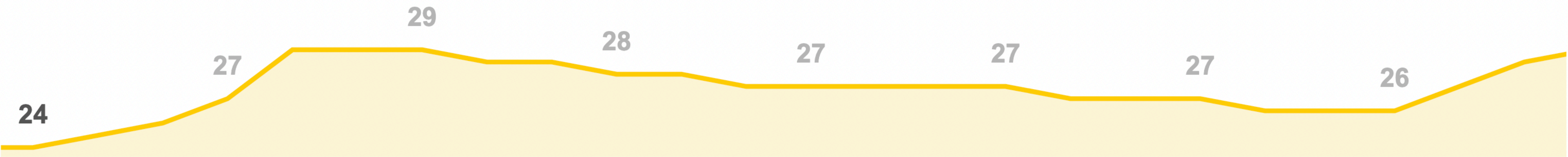
Thursday 10:00 am









Light thunderstorms and rain

Temperature

Precipitation

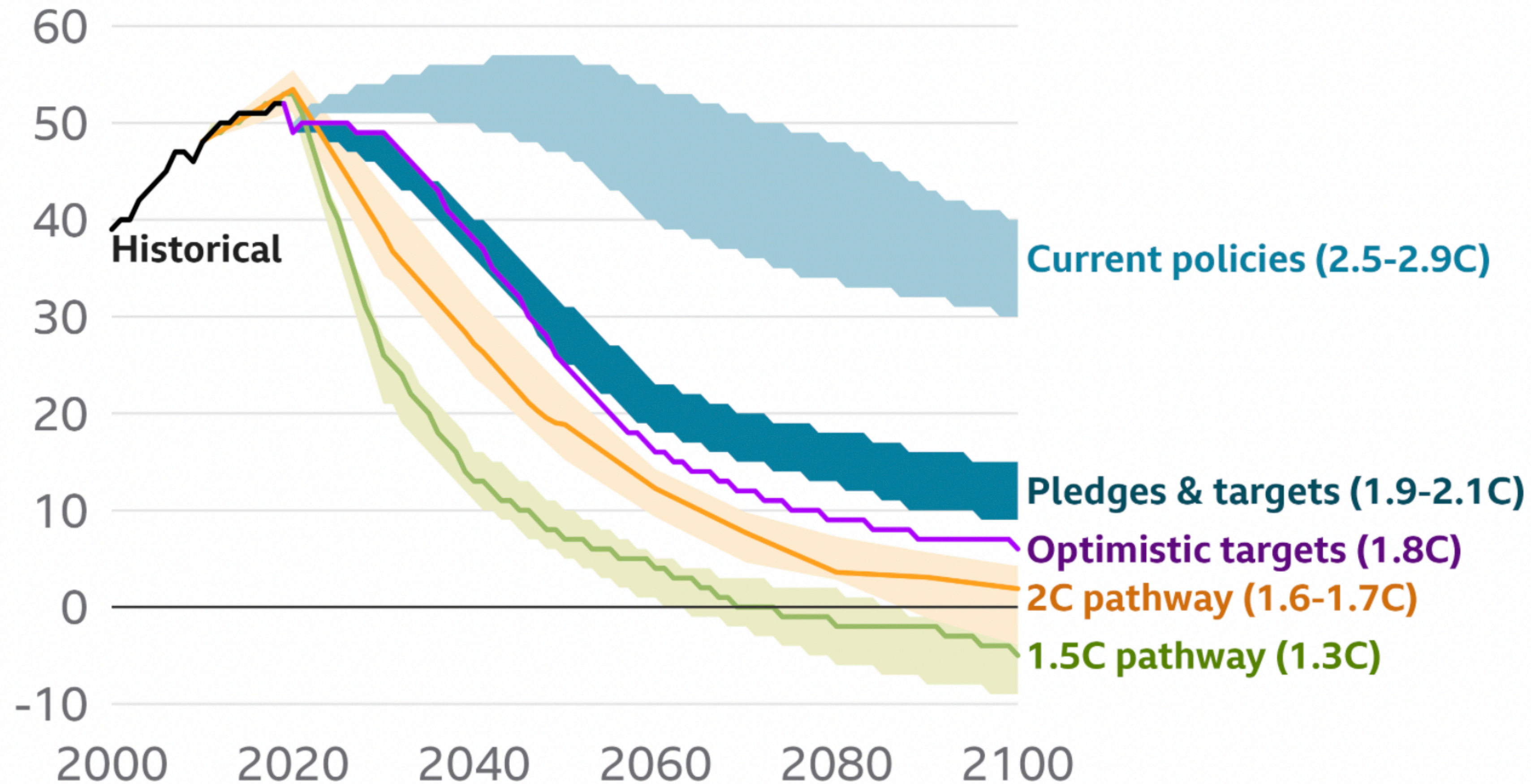
Wind



Thu	Fri	Sat	Sun	Mon	Tue	Wed	Thu
							
29° 24°	30° 26°	30° 26°	31° 26°	30° 26°	30° 26°	31° 26°	31° 25°

Problem 2: what-if scenarios

Past and projected emissions in gigatonnes of carbon dioxide



Source: Climate Action Tracker

BBC

Both are important

- Long-term forecasting allows policy decisions to be 'data' driven
- Nowcasts and short-term projections allow resources to be allocated more

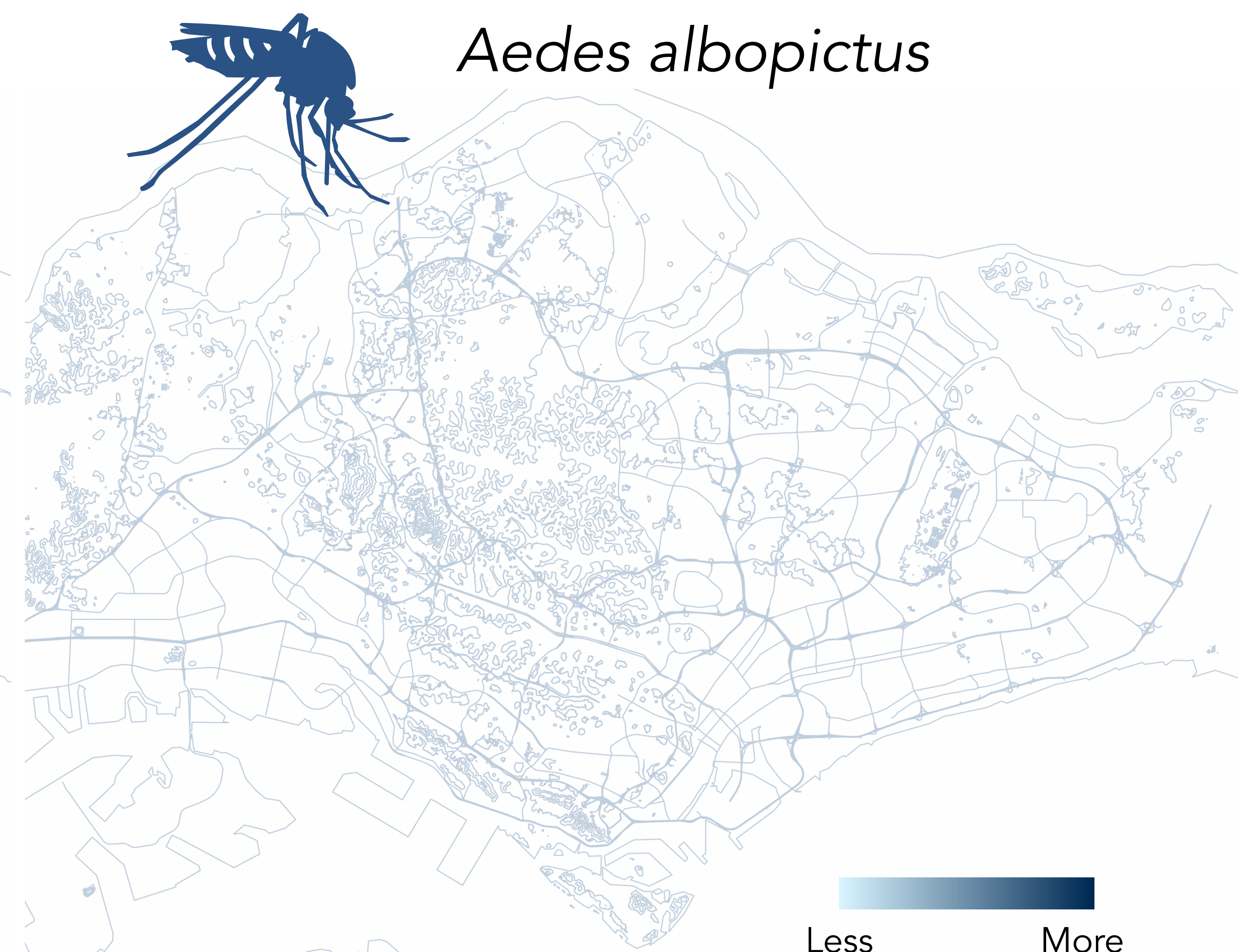
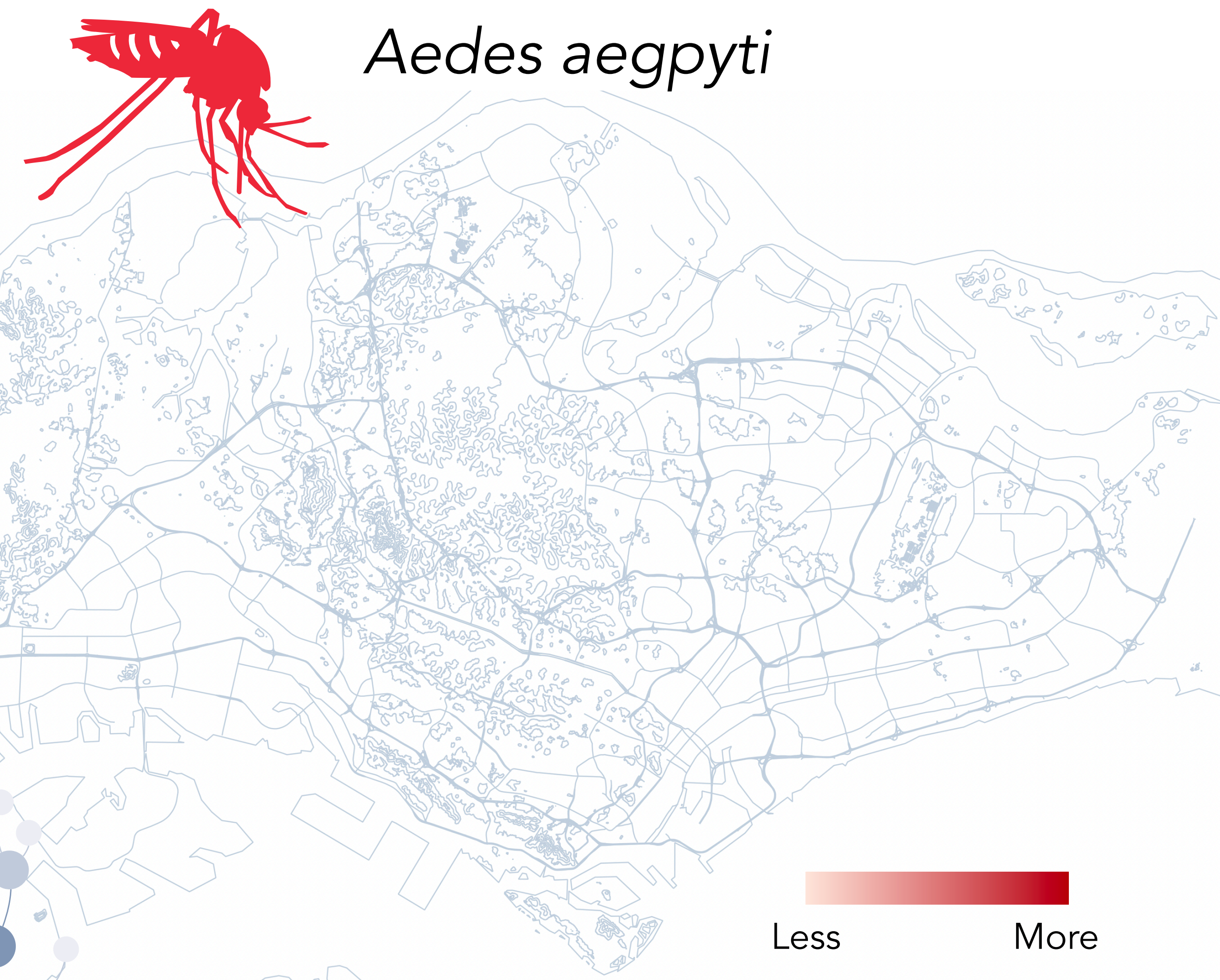
Spatial determinants of mosquito breeding

Gravitraps

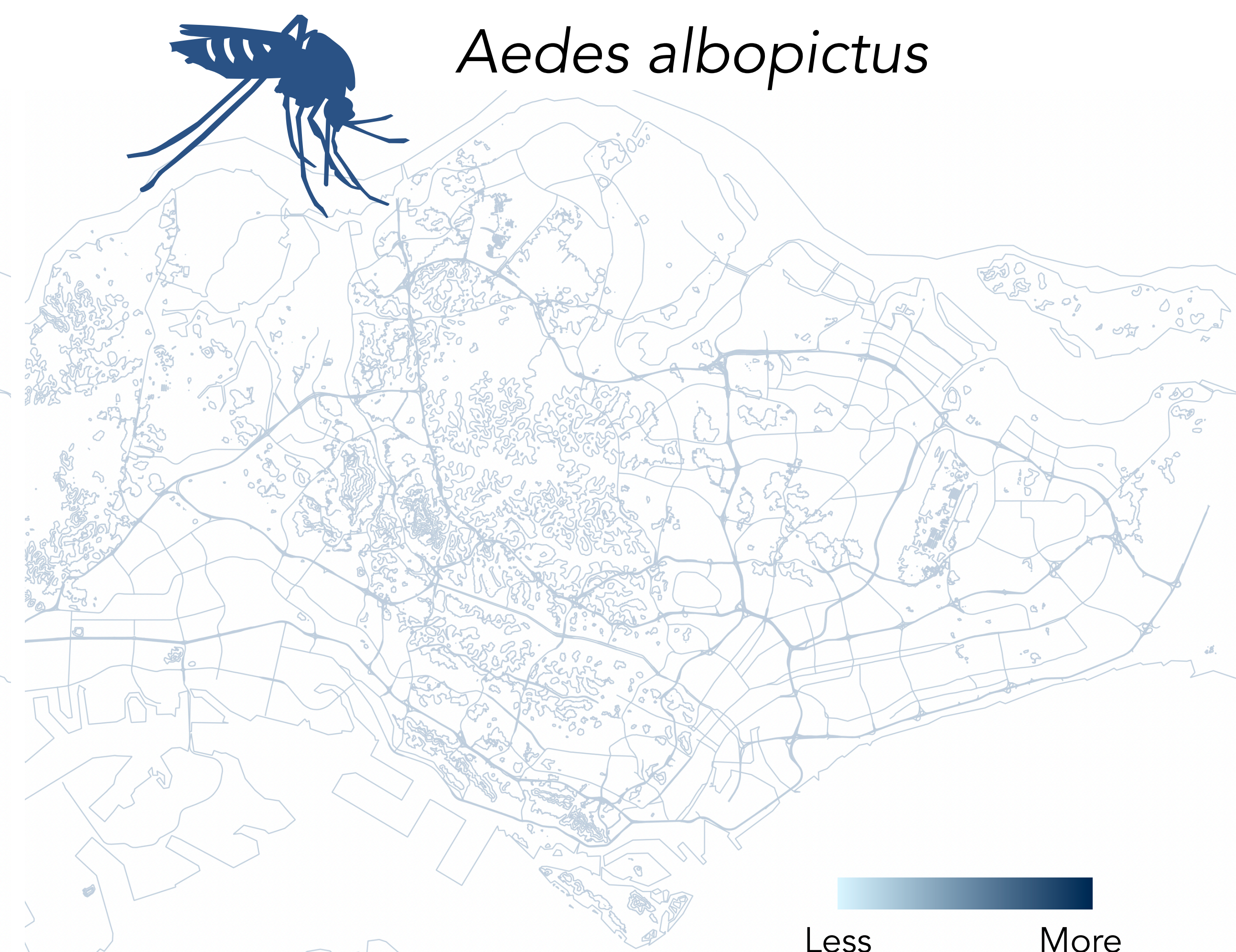
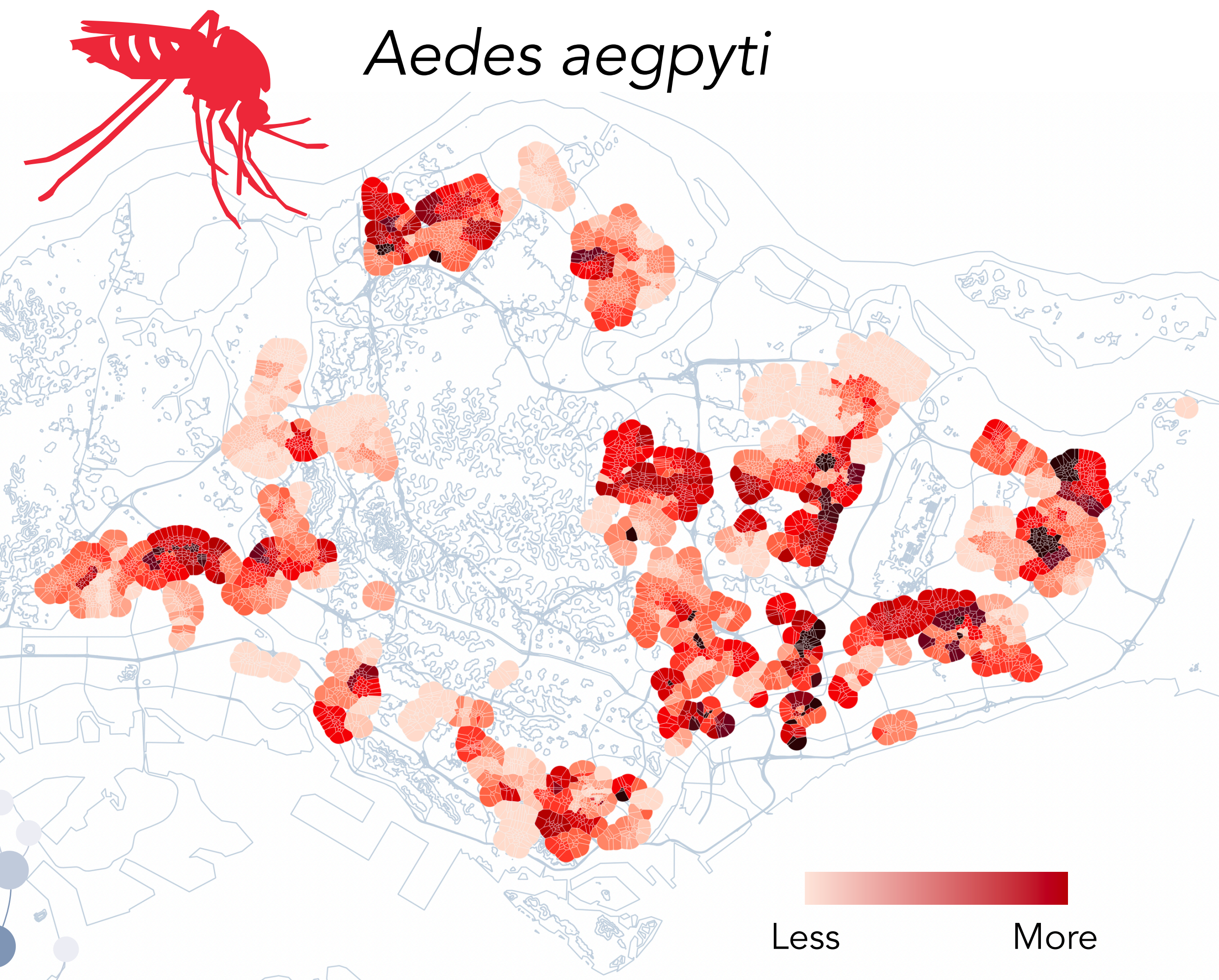
- Mosquitoes **attracted by scent** and **availability of water** to oviposit
- They then stick to the sides, reducing the adult population
- Eggs that hatch cannot emerge because of the mesh
- Placed at all HDB blocks
- Used for **surveillance** and to **reduce vector population**



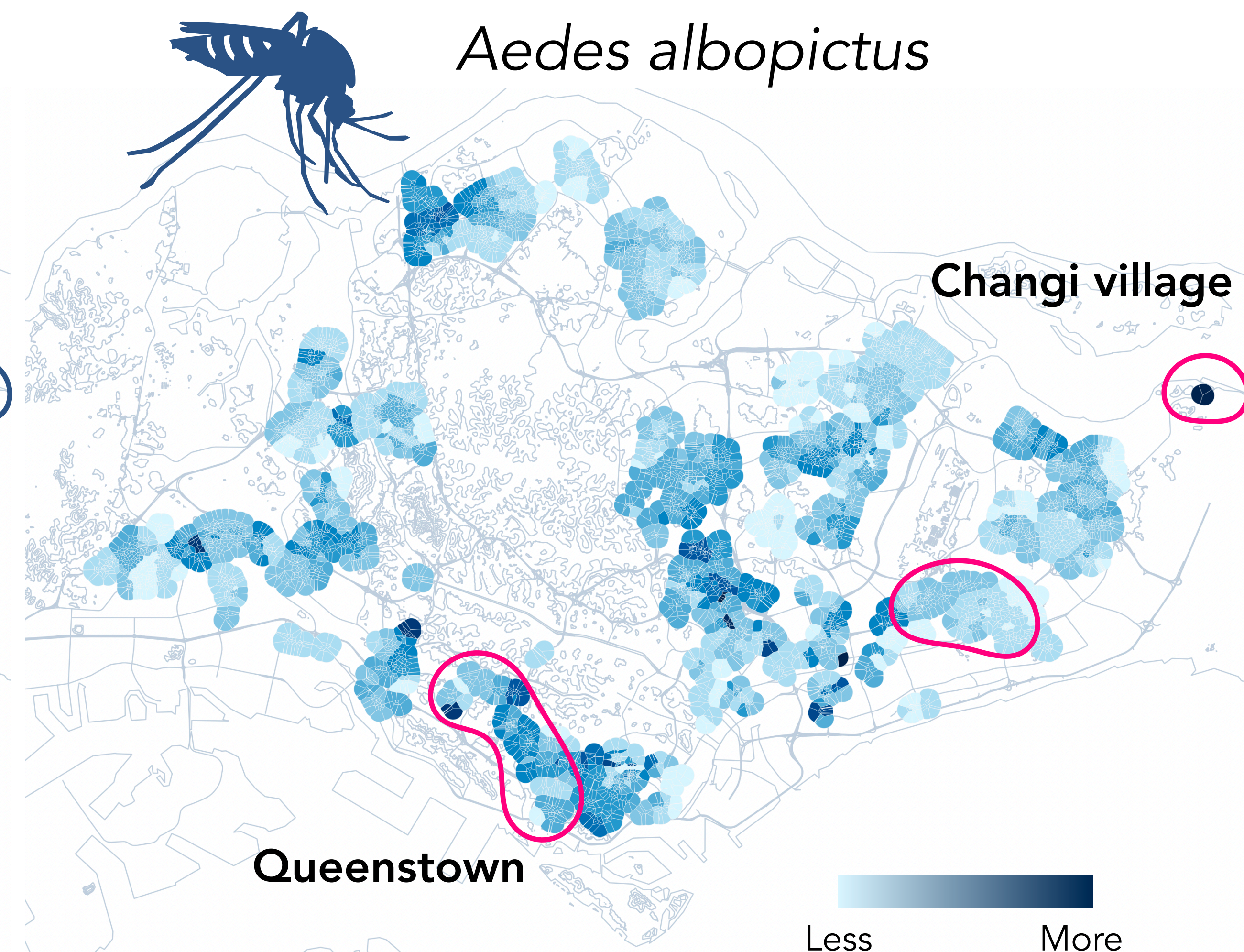
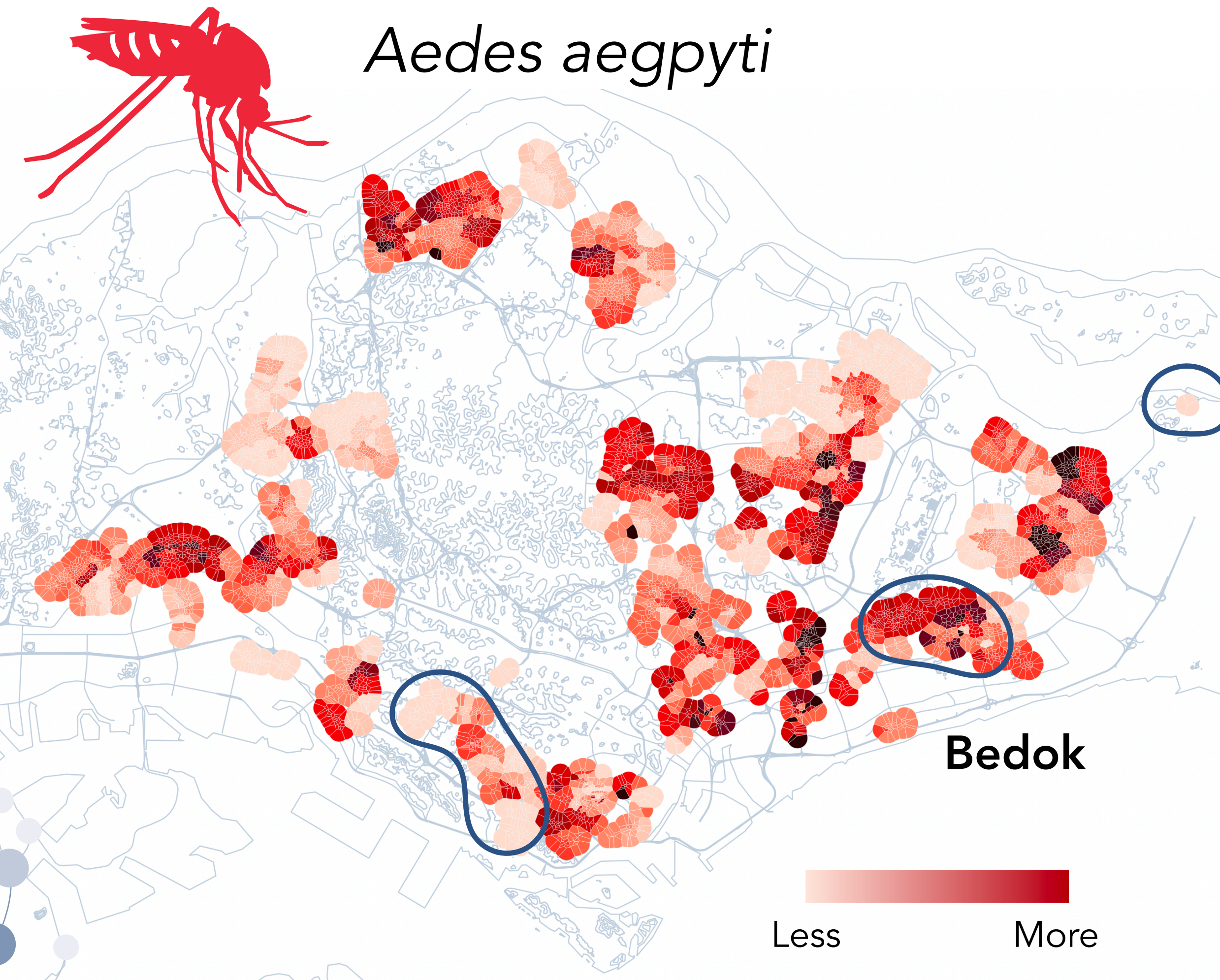
Breeding across residential Singapore



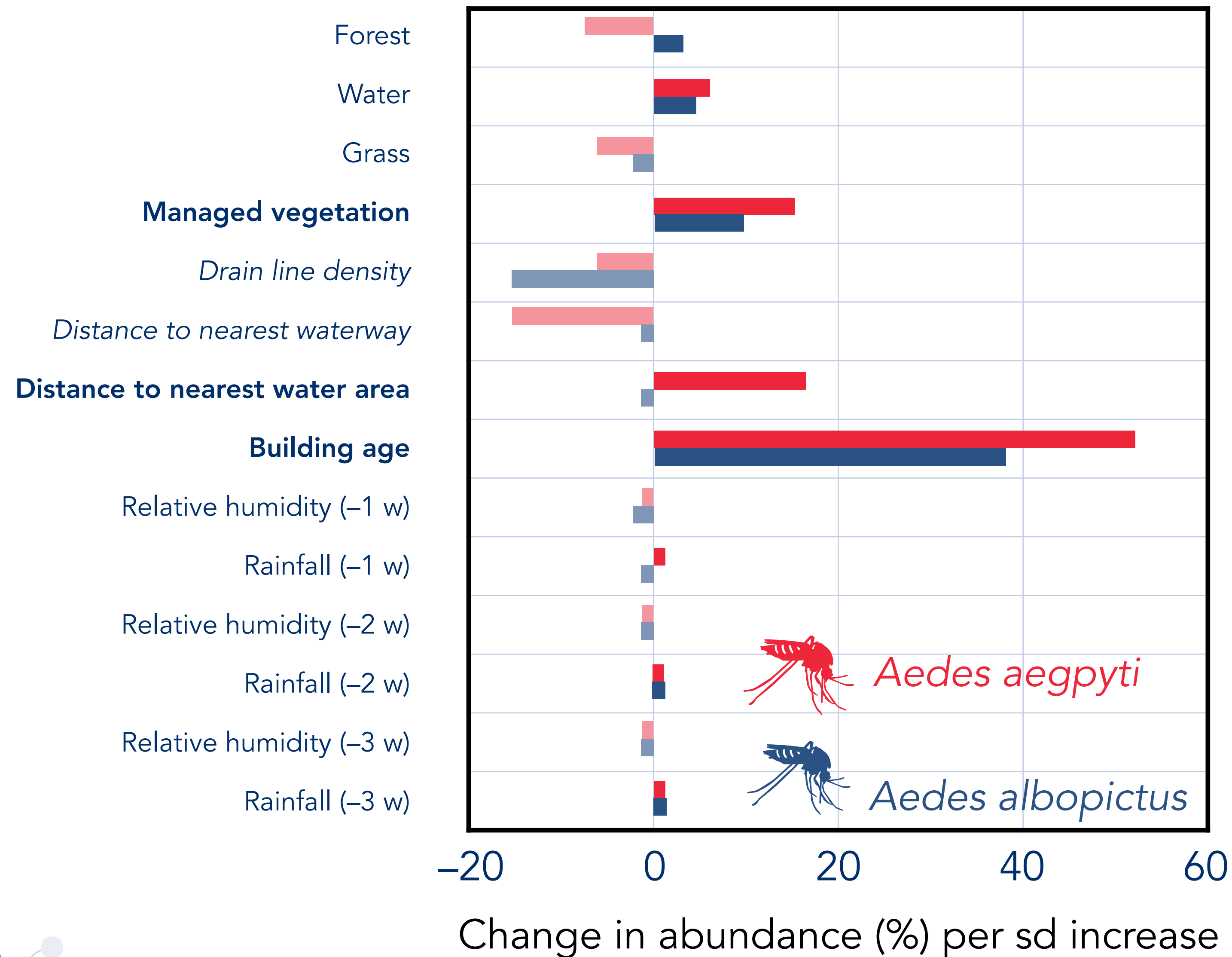
Breeding across residential Singapore



Breeding across residential Singapore



Weather vs urban environment



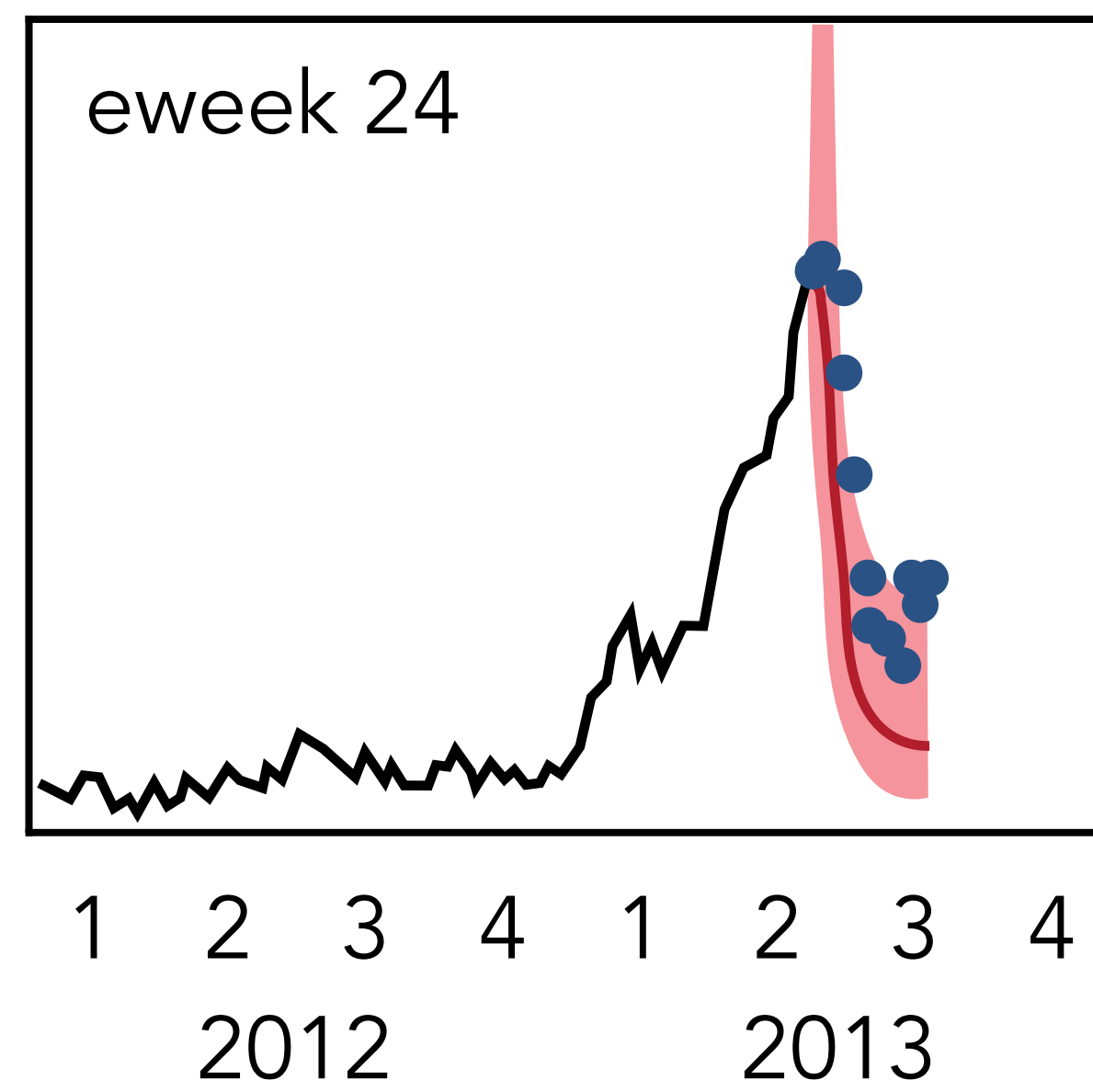
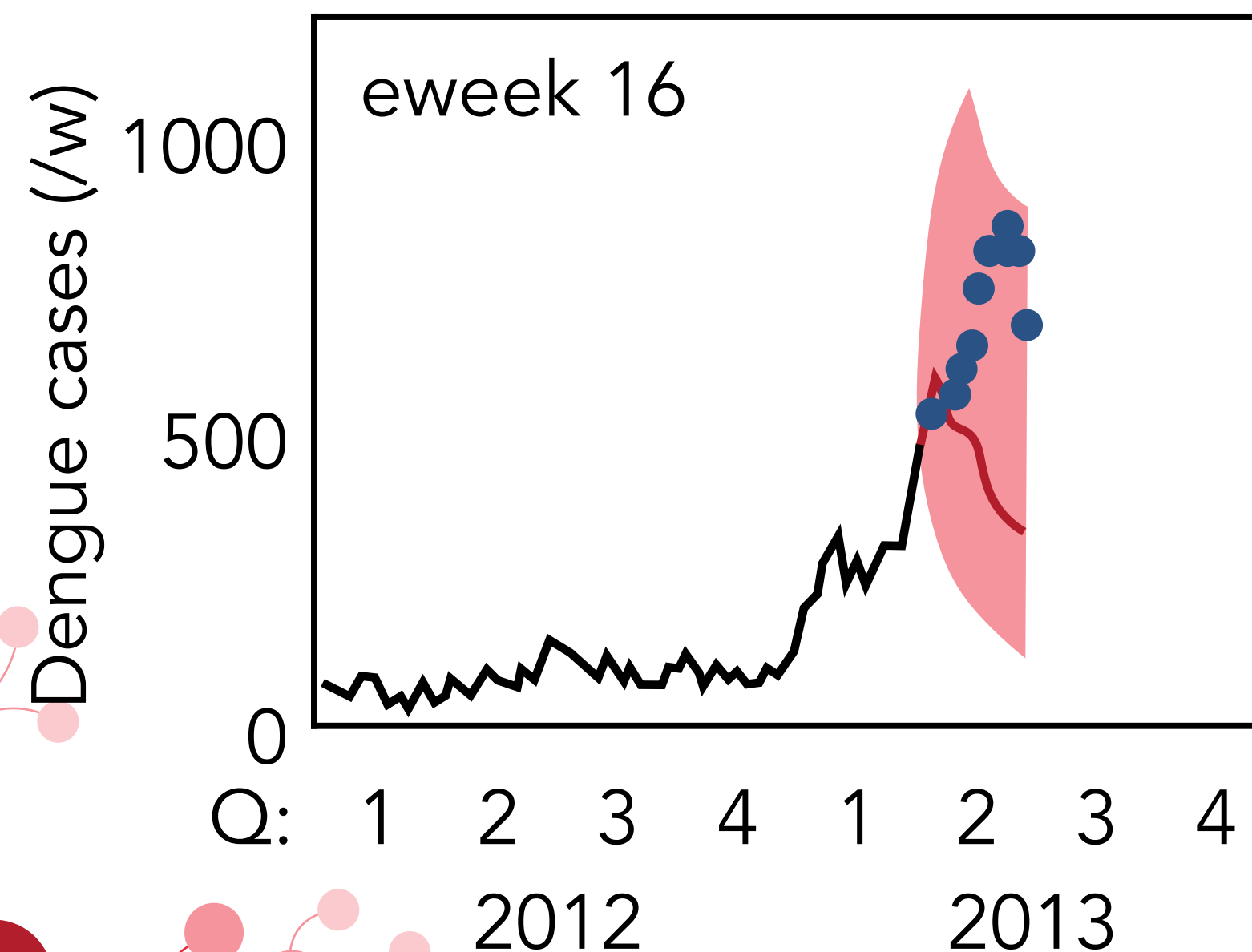
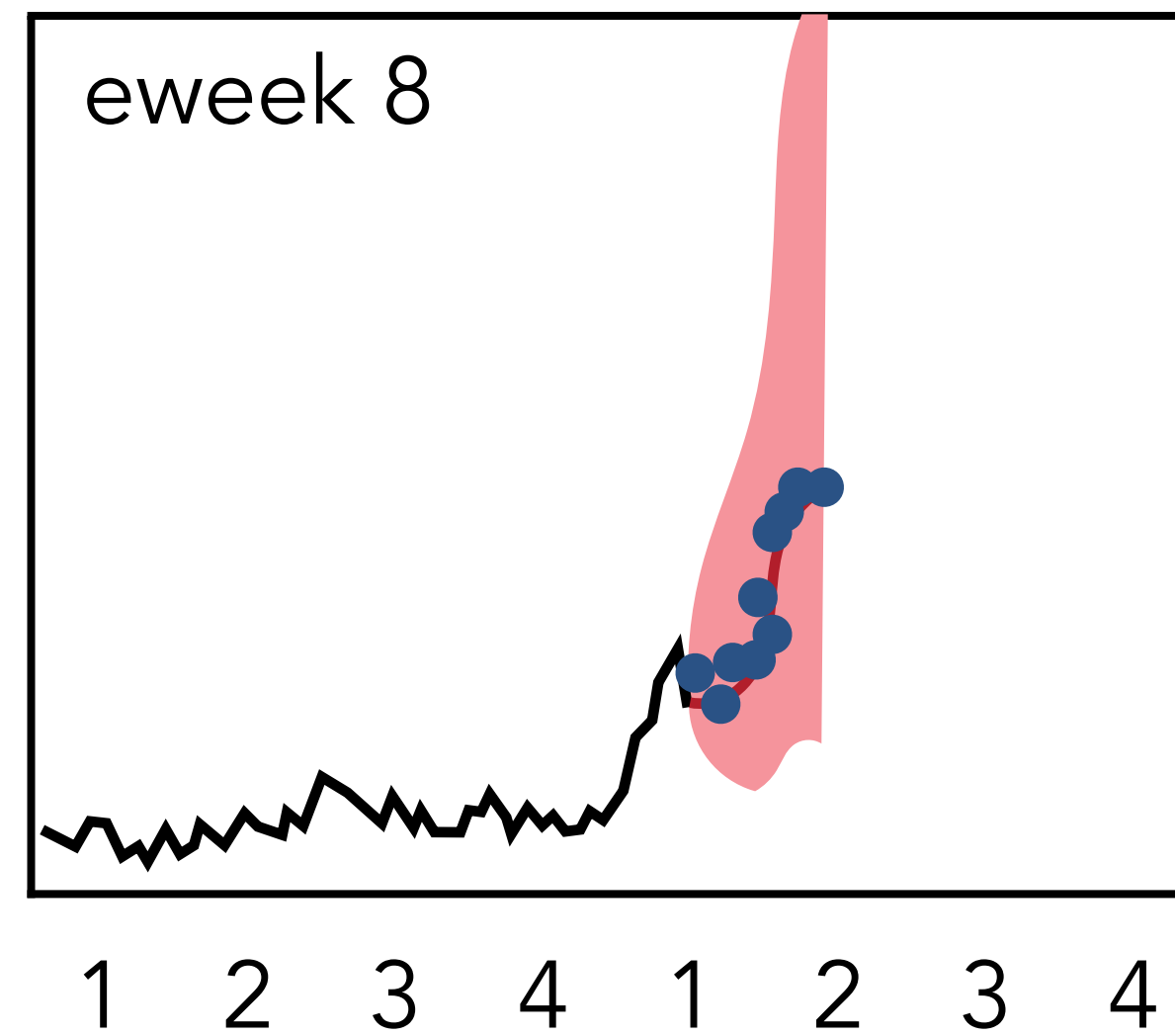
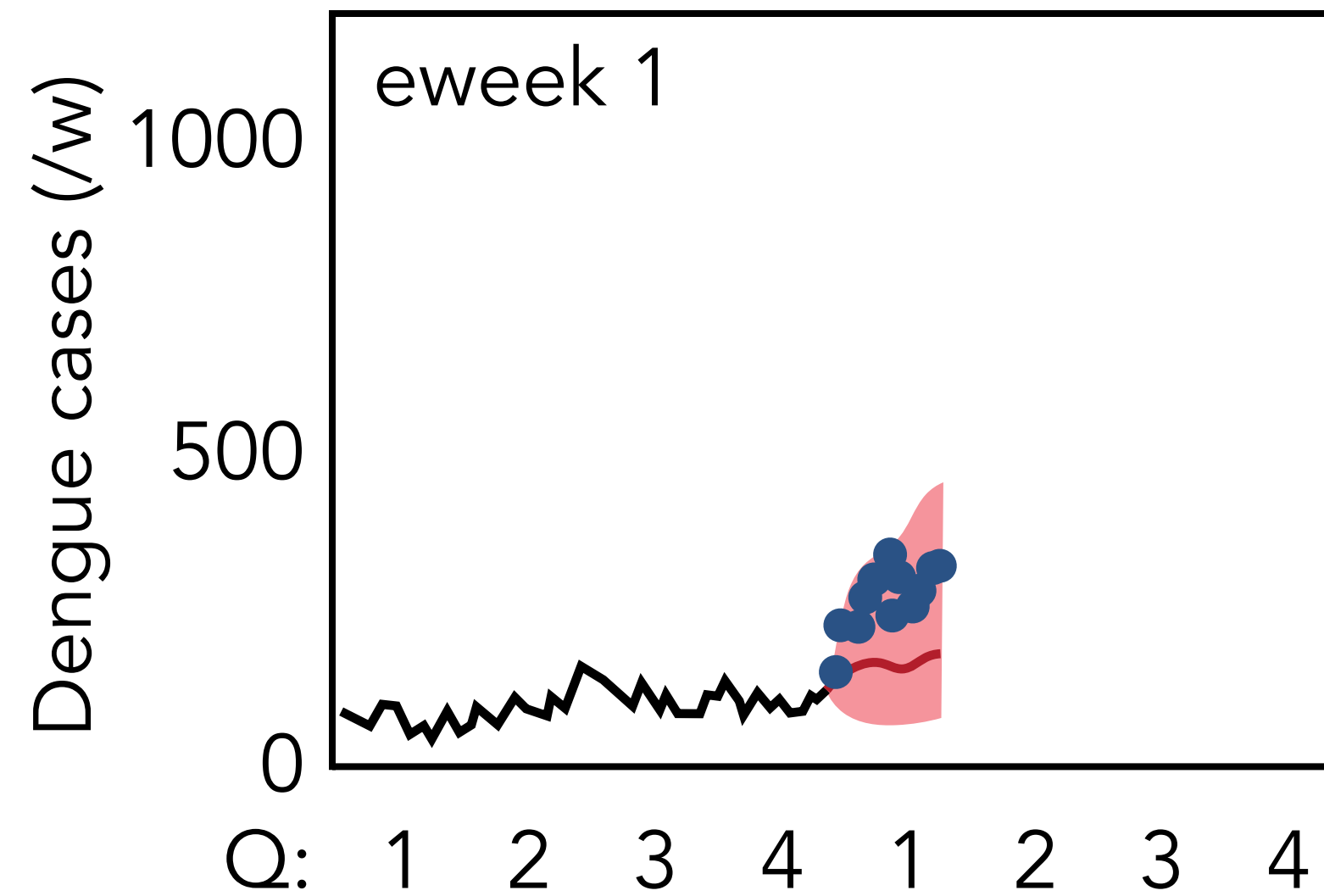
Primary effect is variability in the urban environment: building age and the presence of managed vegetation, of water ways and areas (*Ae aegypti*) and drains (*Ae albopictus*)

Much smaller effect due to recent rainfall or humidity



Creating dynamic risk maps

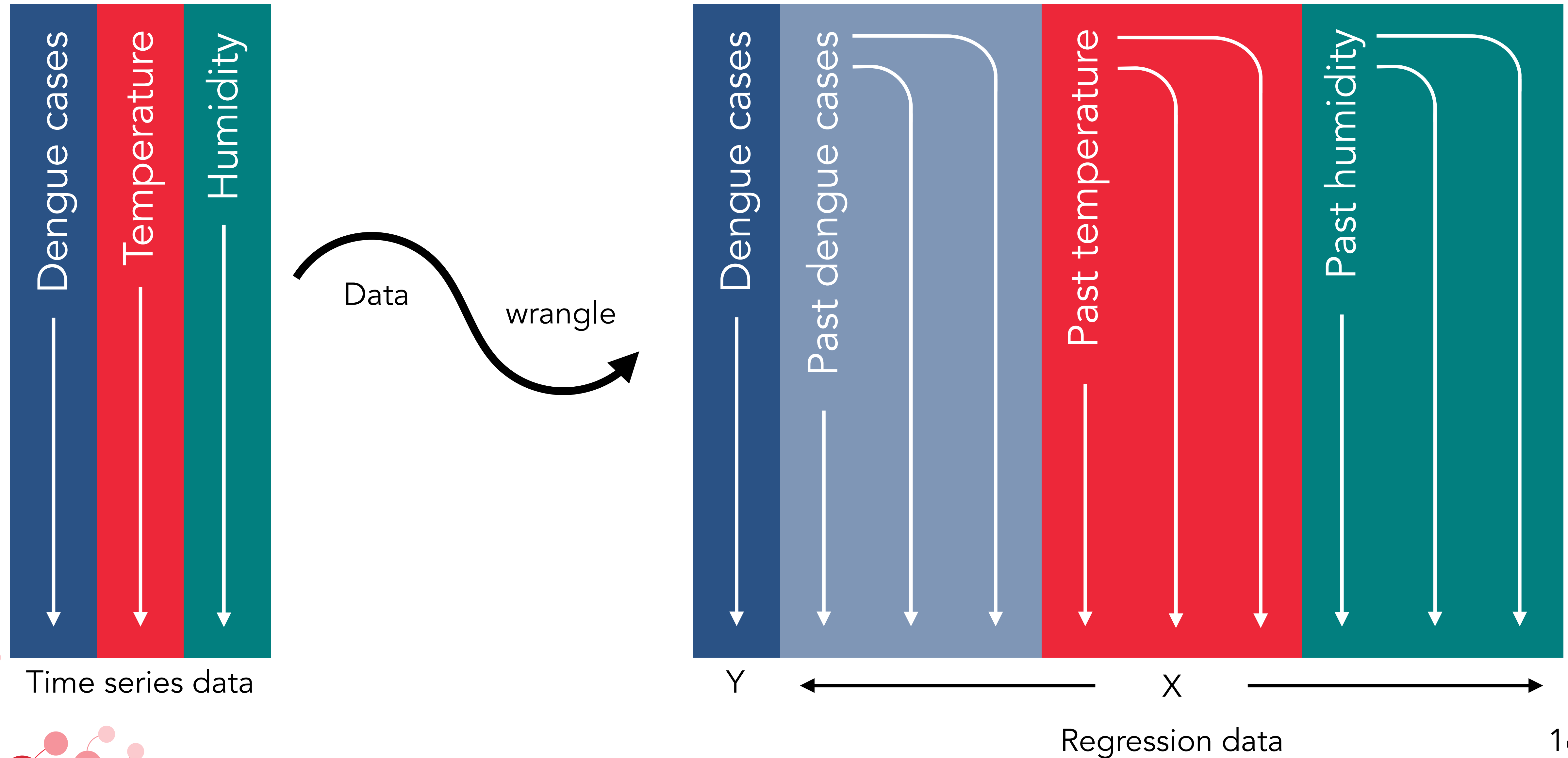
Dengue forecasting



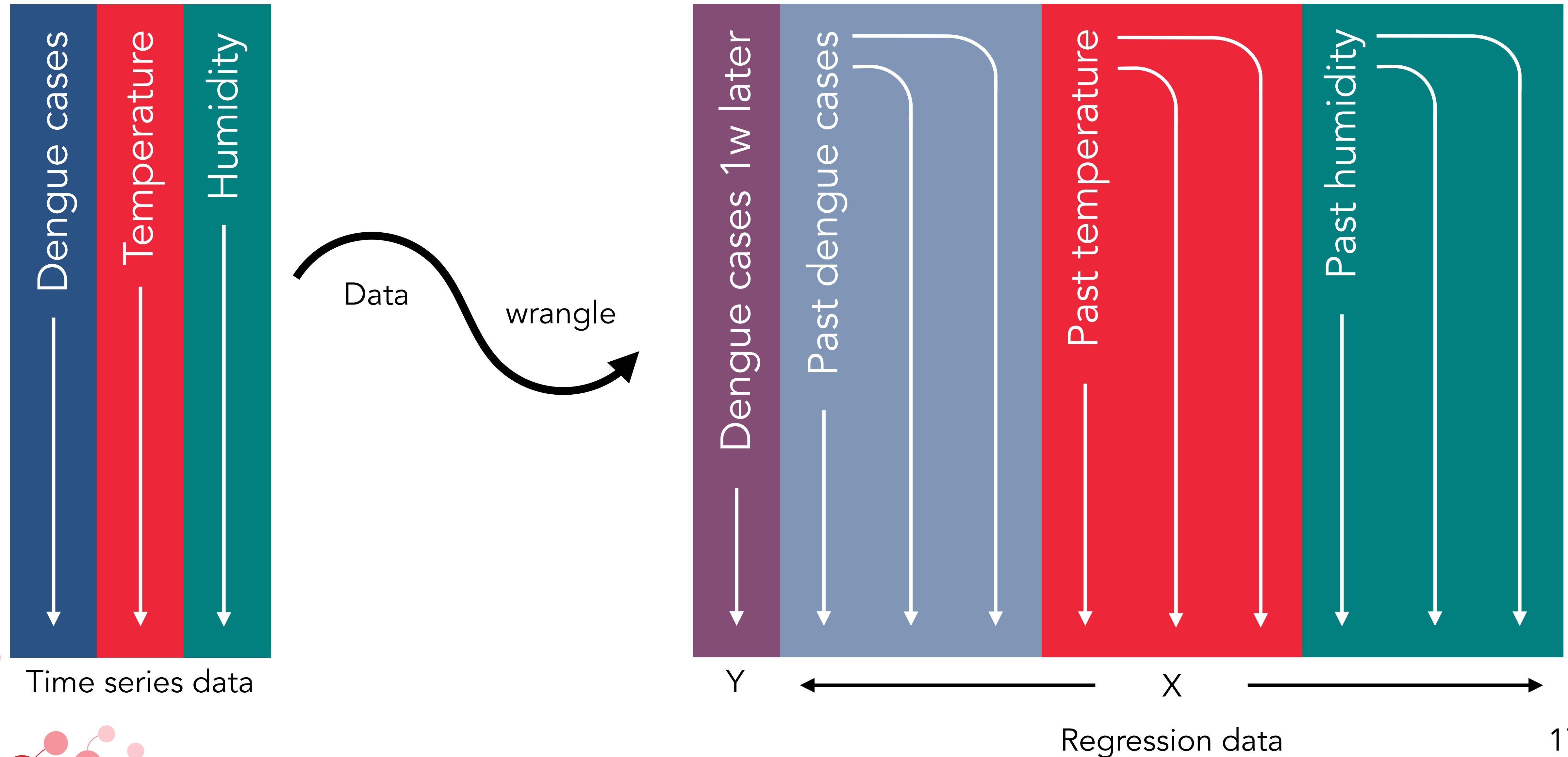
- For about a decade, NEA and NUS have had a dengue forecast algorithm to forewarn of looming epidemics
- **Successfully predicted the then record breaking 2013 outbreak**



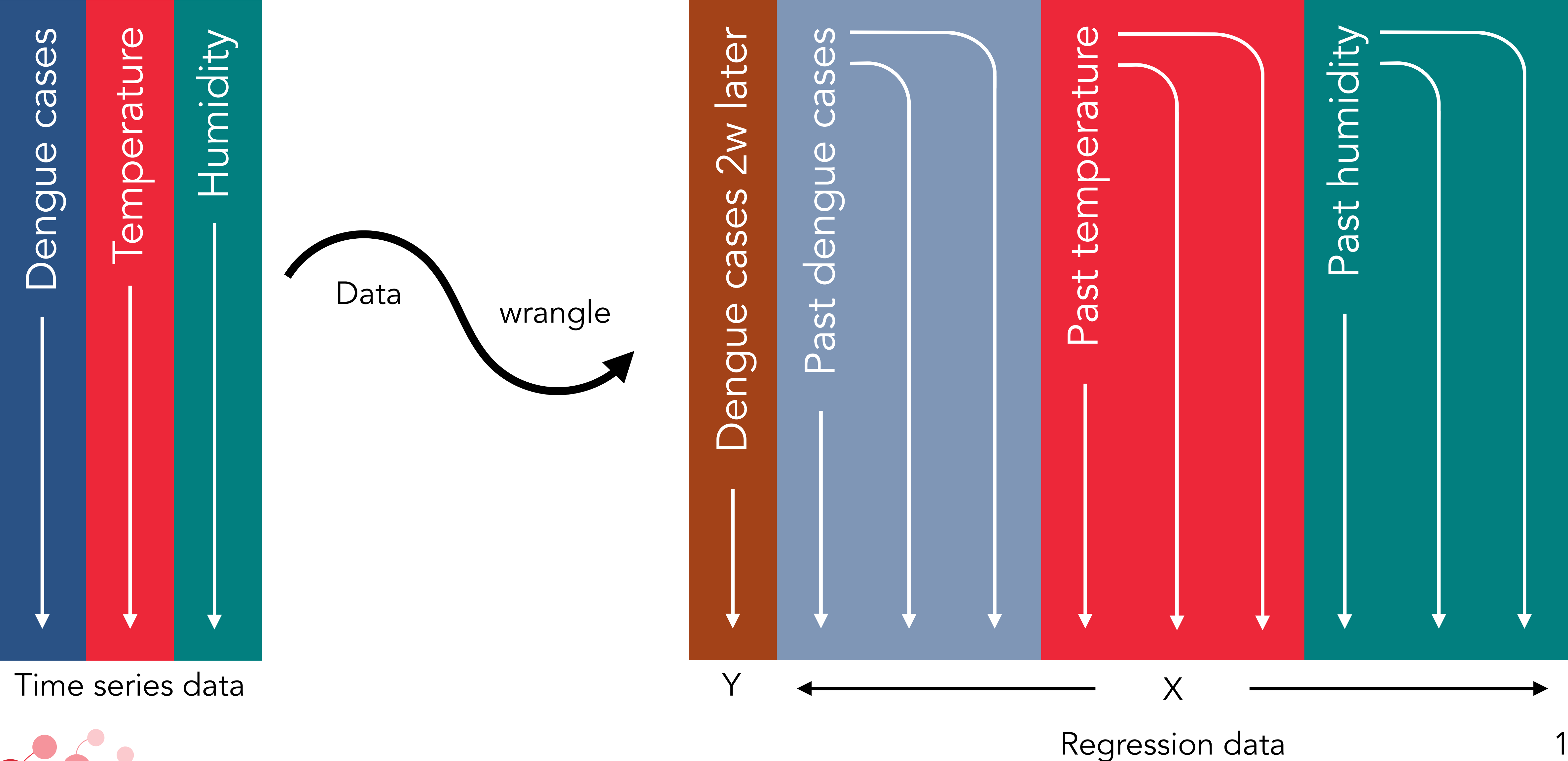
General approach



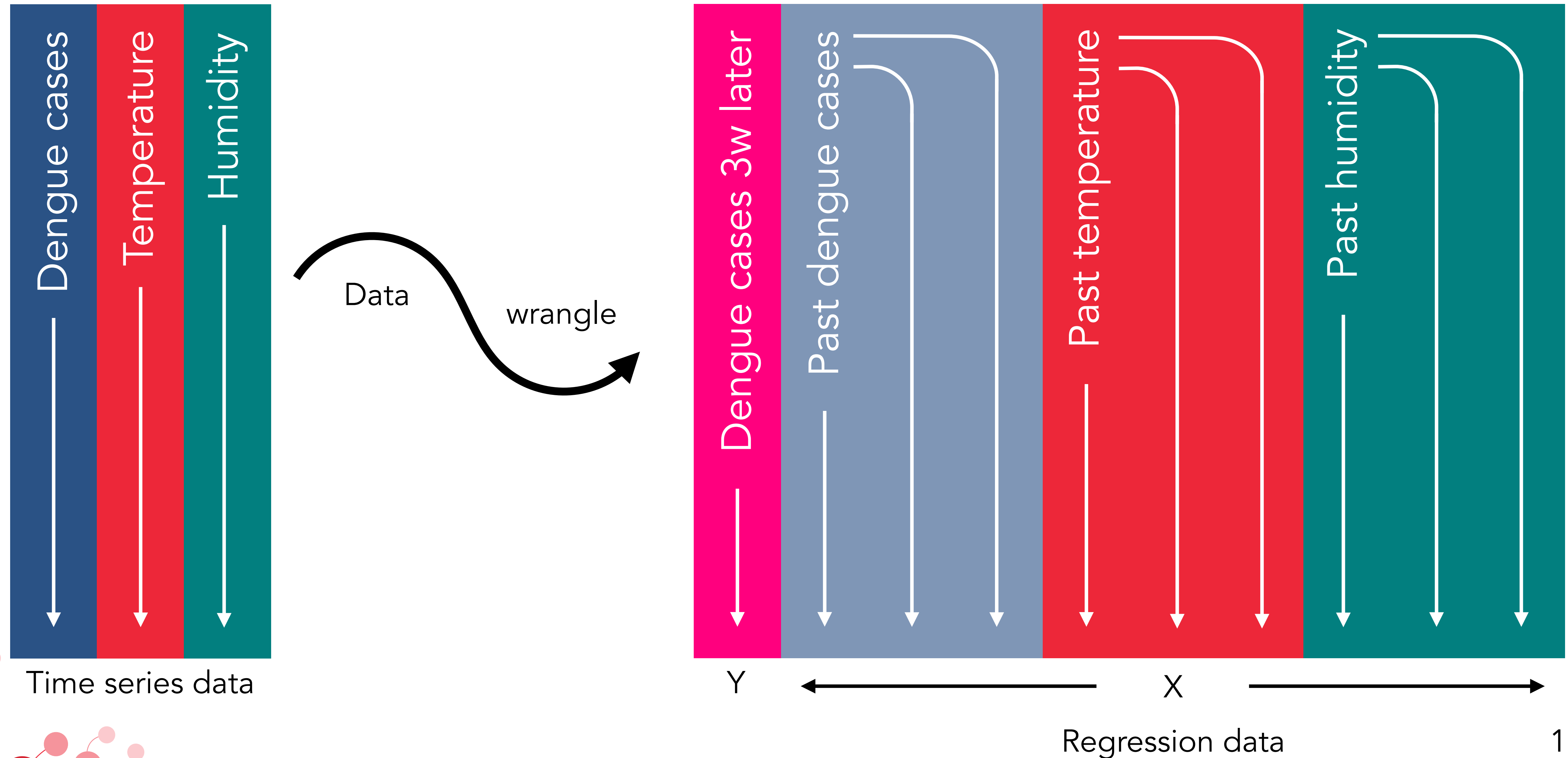
General approach



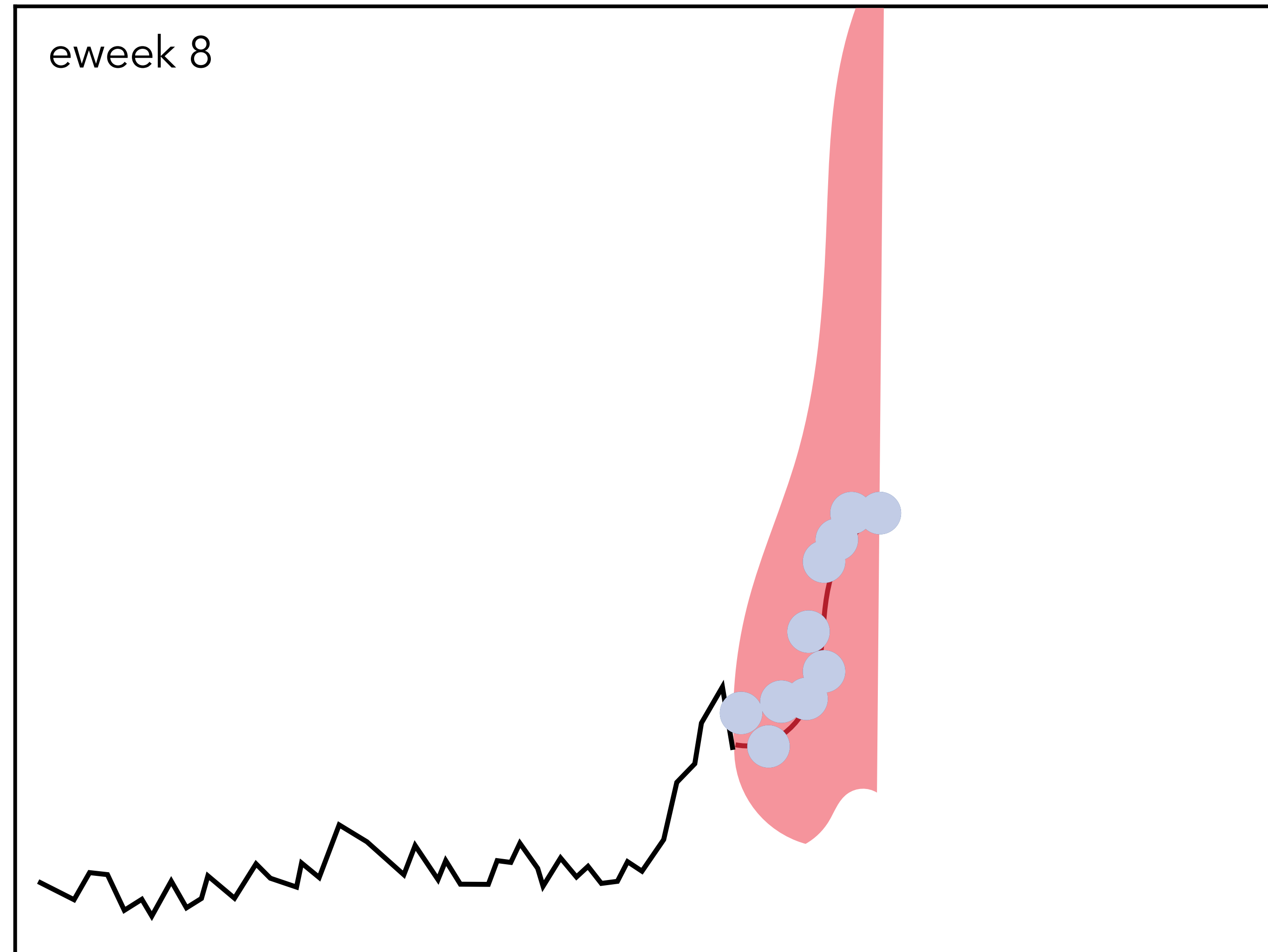
General approach



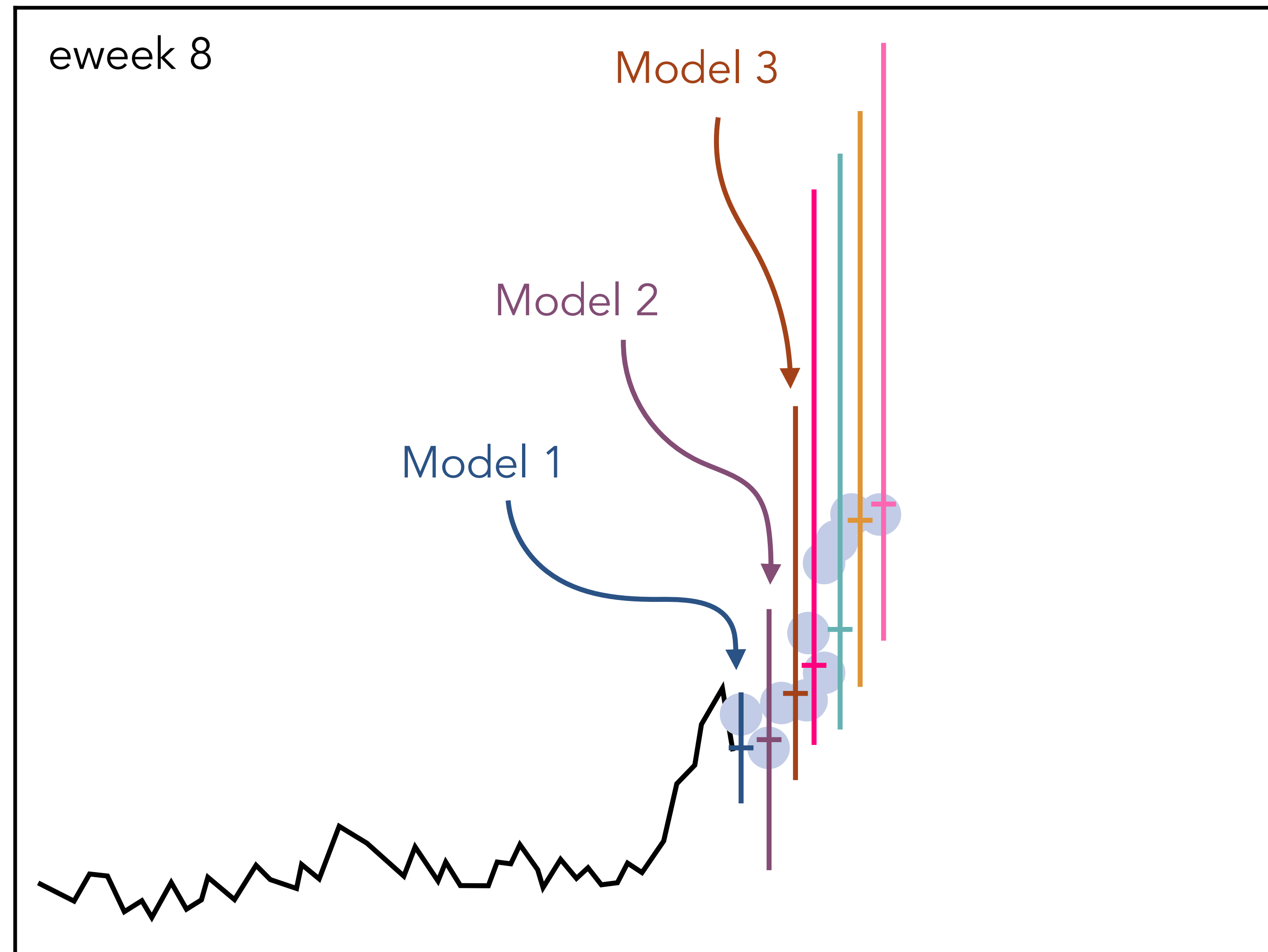
General approach



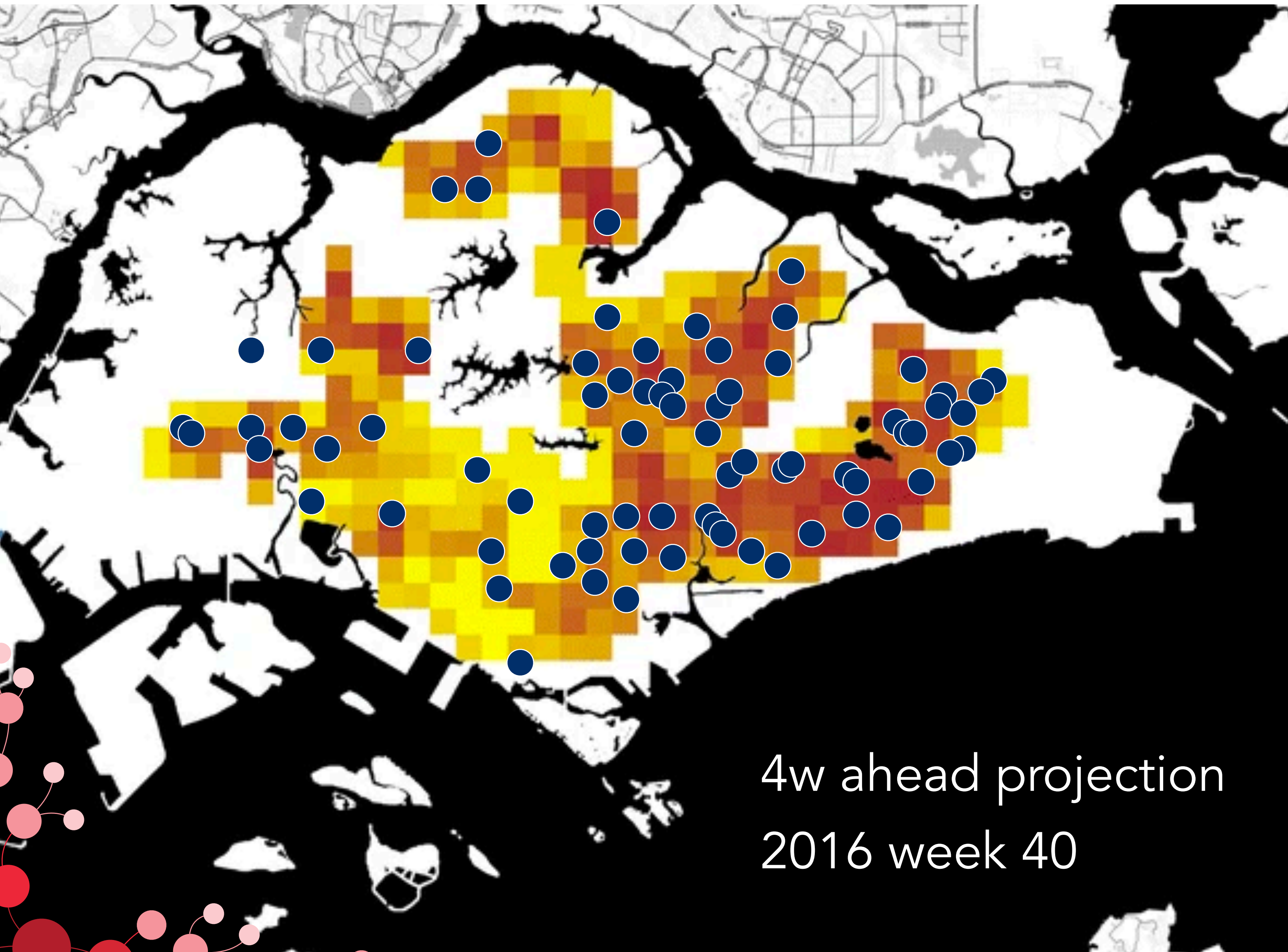
Forecasting as sleight of hand



Forecasting as sleight of hand



Spatiotemporal projections



Extended the idea to create **dynamic forecast maps**, projecting how many cases in the weeks ahead in each neighbourhood



Despatialising spatiotemporal data

Dengue cases

Past dengue cases

Nearby (past) dengue cases

Convert spatial
data to matrix

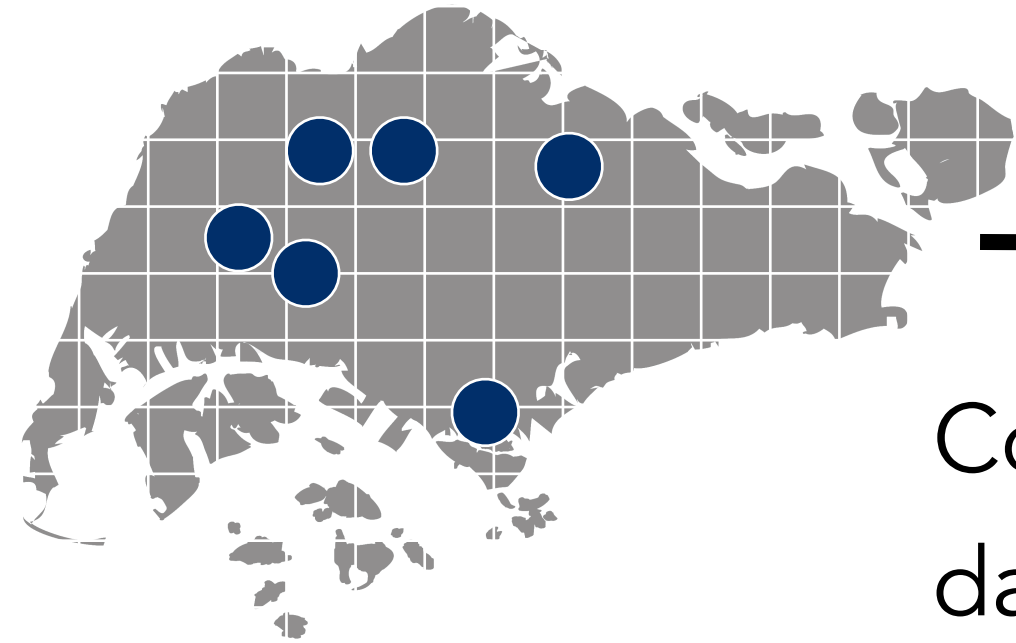
Temperature

Humidity

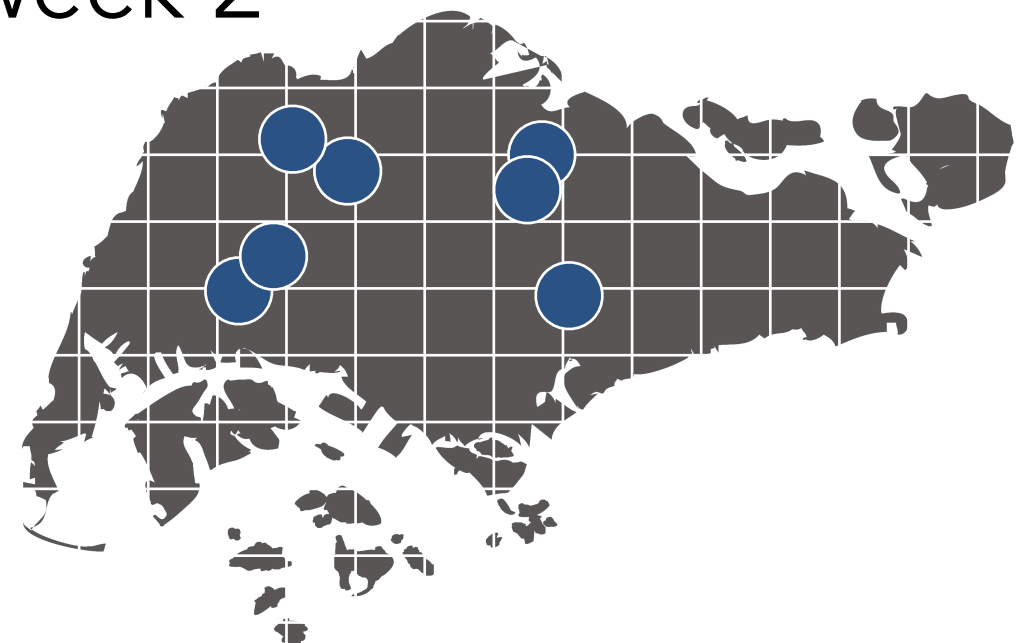
Aggregate
across time

Repeat for
different
forecast
windows and
build models

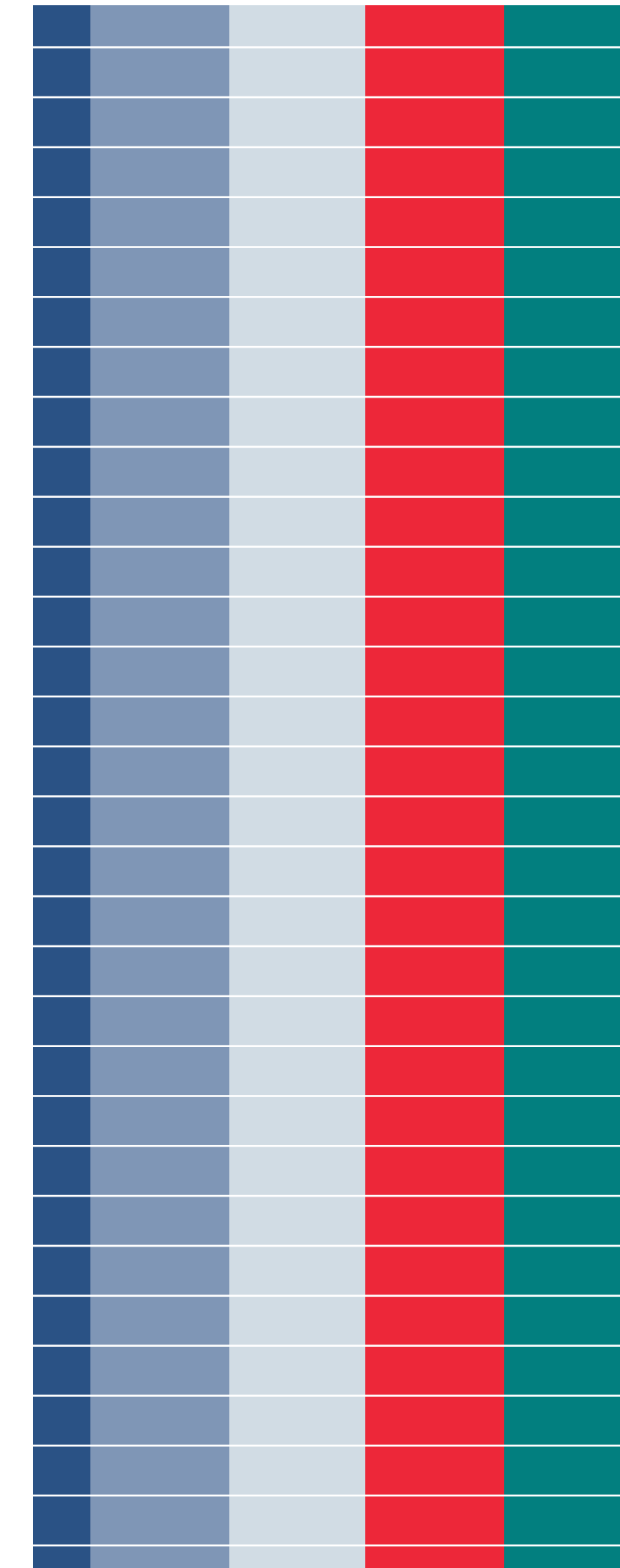
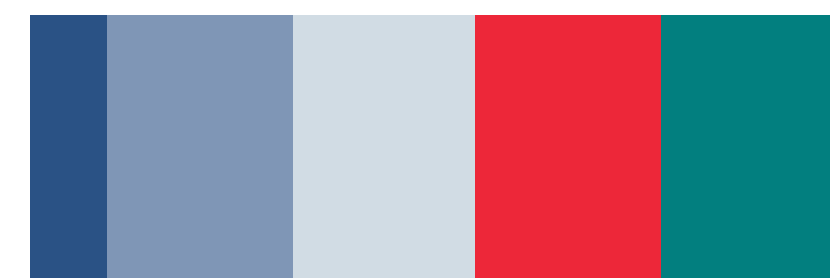
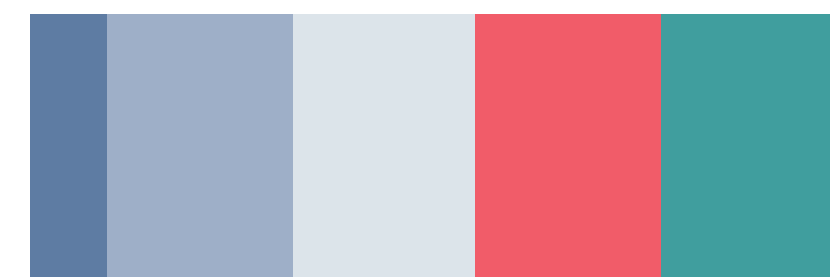
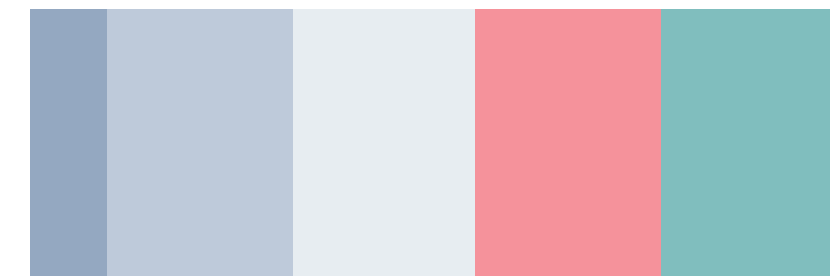
Eweek 1



Eweek 2



Eweek 3



The future of dengue analytics

Future adaptations

- **Approach is agnostic to data types:** spatiotemporal model uses spatiotemporal, spatial and temporal data:
 - Incidence, mosquito breeding, weather, age of estates
 - Seroprevalence? Serotypes? Population flux?
- **If the model is right it's wrong:** identifying priority areas hopefully means the targeted areas have less dengue

Ongoing work

Use modelling to evaluate the impact of novel forms of control (eg Wolbachia) and inform optimal deployment

Acknowledgments

Funding from

NMRC, MOE, NEA, NRF

Work by

Chen Yirong, Bo Dickens, Lim Jue Tao, Sun Haoyang
plus our great collaborators EHI @ NEA