

1) Modelling infectious disease transmission potential as a function of human behaviour

2) Mobility data during the pandemic

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## Modelling infectious disease transmission potential as a function of human behaviour

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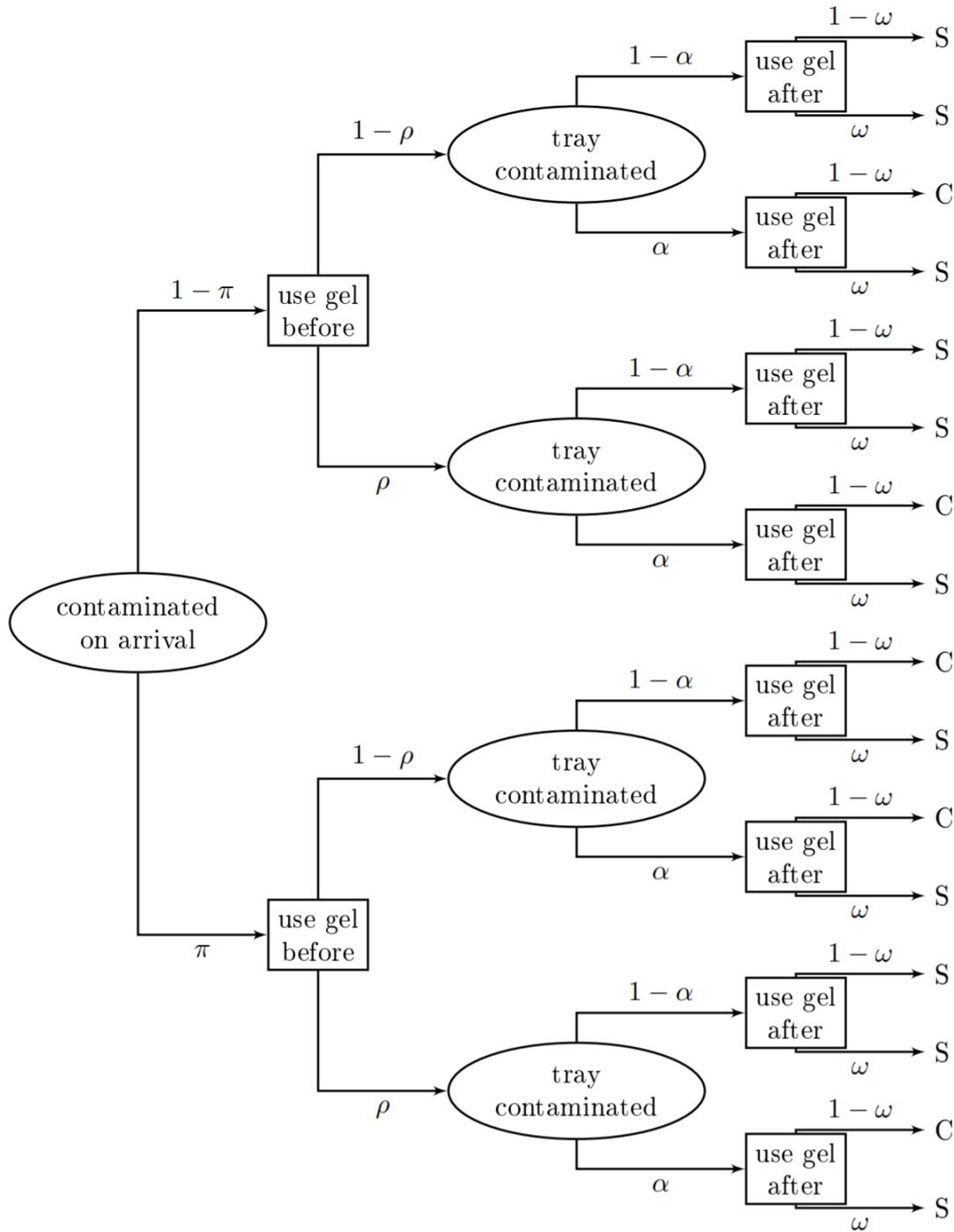
# Motivation

- Project requirement: infectious disease interventions within transport hubs
- Collaborators highlighted airport security luggage screening as potential contamination risk

Contamination  $\neq$  Infection



- Collaborators suggested hand hygiene intervention for influenza – antimicrobial gel
- Opportunity to explicitly model human behaviour – collaborate with behavioural scientists.  
Build's on recommendations in (Weston *et al.*, 2018, BMC Public Health).



# Model

$\pi$	Probability of a person being contaminated on arrival
$\alpha$	Probability of becoming contaminated after handling the trays
$\rho$	Probability of complying prior to handling the tray
$\omega$	Probability of complying after handling the tray

# Scenarios

Does antimicrobial gel before or after luggage screening most reduce the probability of contamination?

Compare scenarios:

- 1) gel available only before screening
- 2) gel available only after screening

At steady state:

if

compliance before = compliance after

then

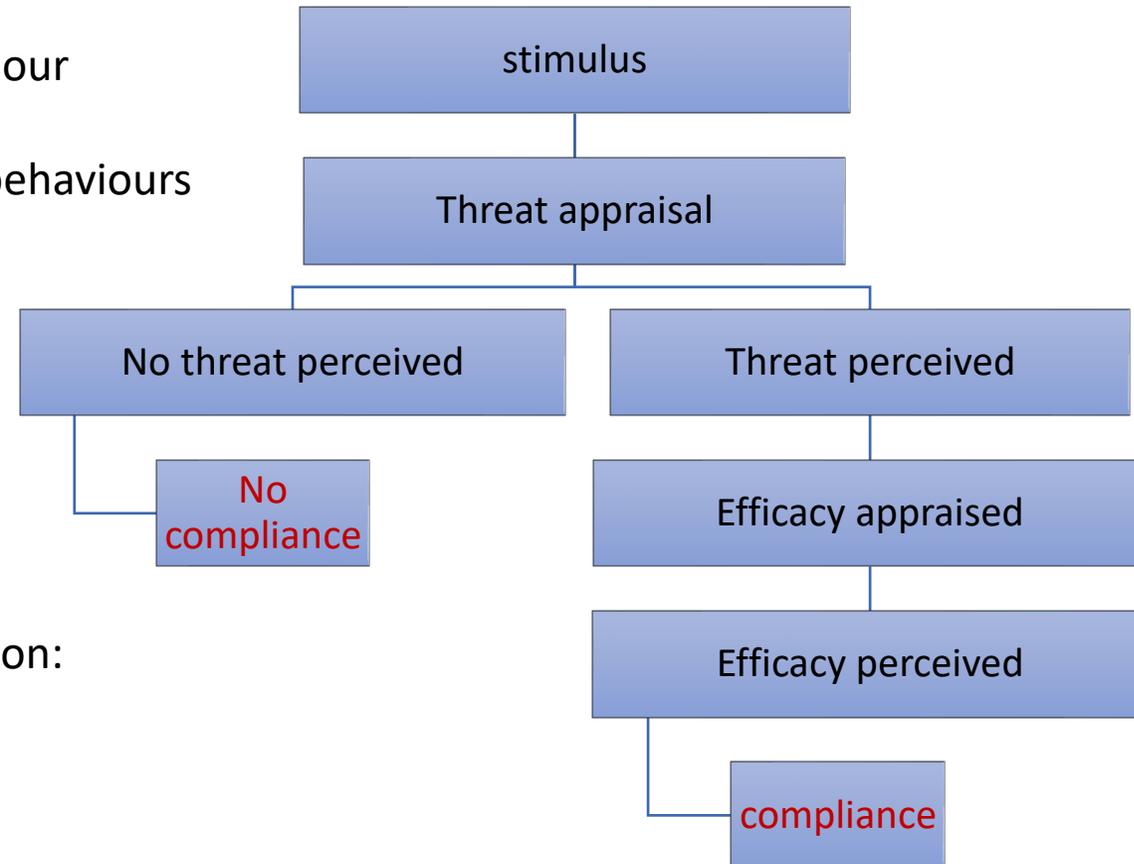
$P(\text{contamination} \mid \text{gel before}) > P(\text{contamination} \mid \text{gel after})$

**BUT** compliance before  $\neq$  compliance after ??

# Behavioural theory

## *Extended Parallel Processing Model (Witte, 1992, Comm. Monogr.)*

- Psychological model of behaviour
- Specific to health-protective behaviours



Individual's compliance depends on:

- perceived threat
- perceived efficacy

# Assumptions

- 1) Threat before < threat after
- 2) Efficacy before = efficacy after
- 3) Compliance  $\rightarrow$  function ( threat, efficacy)

What is this functional form?

Can we have

$P(\text{contamination} \mid \text{gel before}) < P(\text{contamination} \mid \text{gel after})$  ?

# Compliance function forms

## 1) Linear in threat \* efficacy

$$f(t, e) = et, \quad (t, e) \in (0,1]^2$$

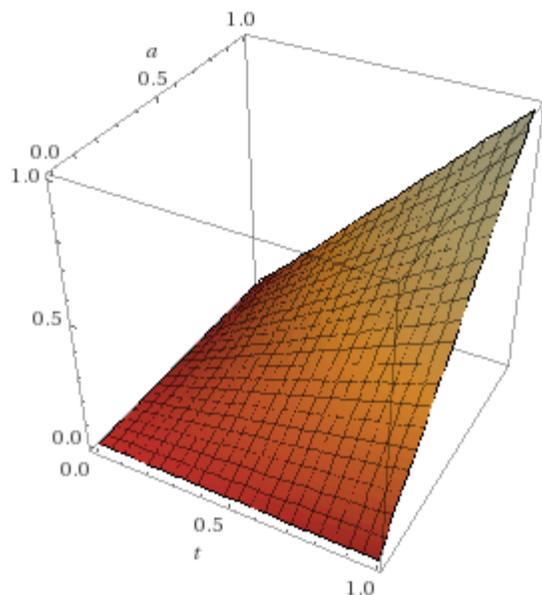
↑ threat ⇒ ↑ compliance

Simplest function

↑ efficacy ⇒ ↑ compliance

Could be representative of EPPM

*Assume relative  $(t, e)$  could be estimated through psychology experiments.*



Gel before screening is never optimal

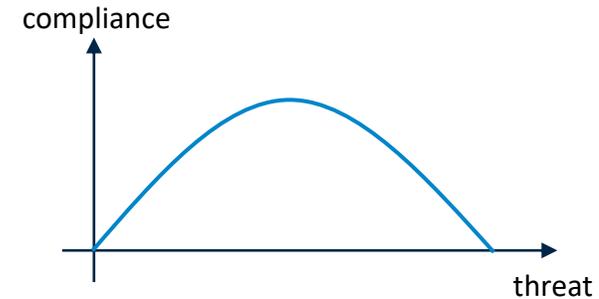
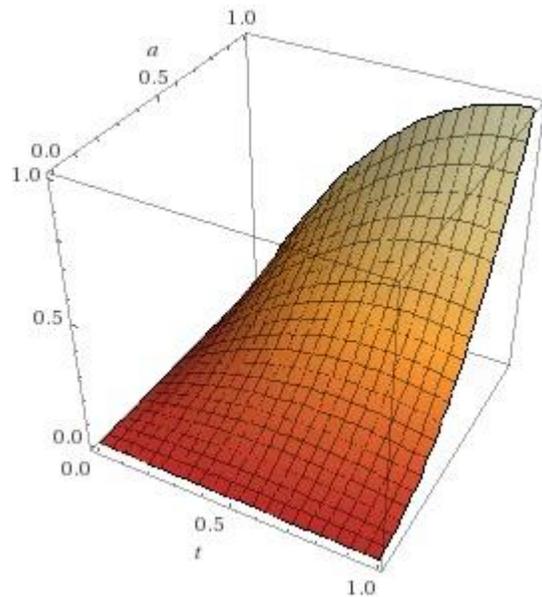
# Compliance function forms

## 2) More complex function

$$f(t, e) = et(e - t + 1), \quad (t, e) \in (0,1]^2$$

↑ threat ⇒ ↑ ↓ compliance

↑ efficacy ⇒ ↑ compliance



Could be better representation of EPPM

Gel before screening is **sometimes optimal**

# Conclusions

- More complex compliance function suggests different intervention strategy
- Possibly of benefit to understand underlying psychological decision-making processes

## Further work (the dream...)

Stratify population on social identity – different efficacy values for different groups

e.g. solo business traveller

holiday with friends

travelling with children

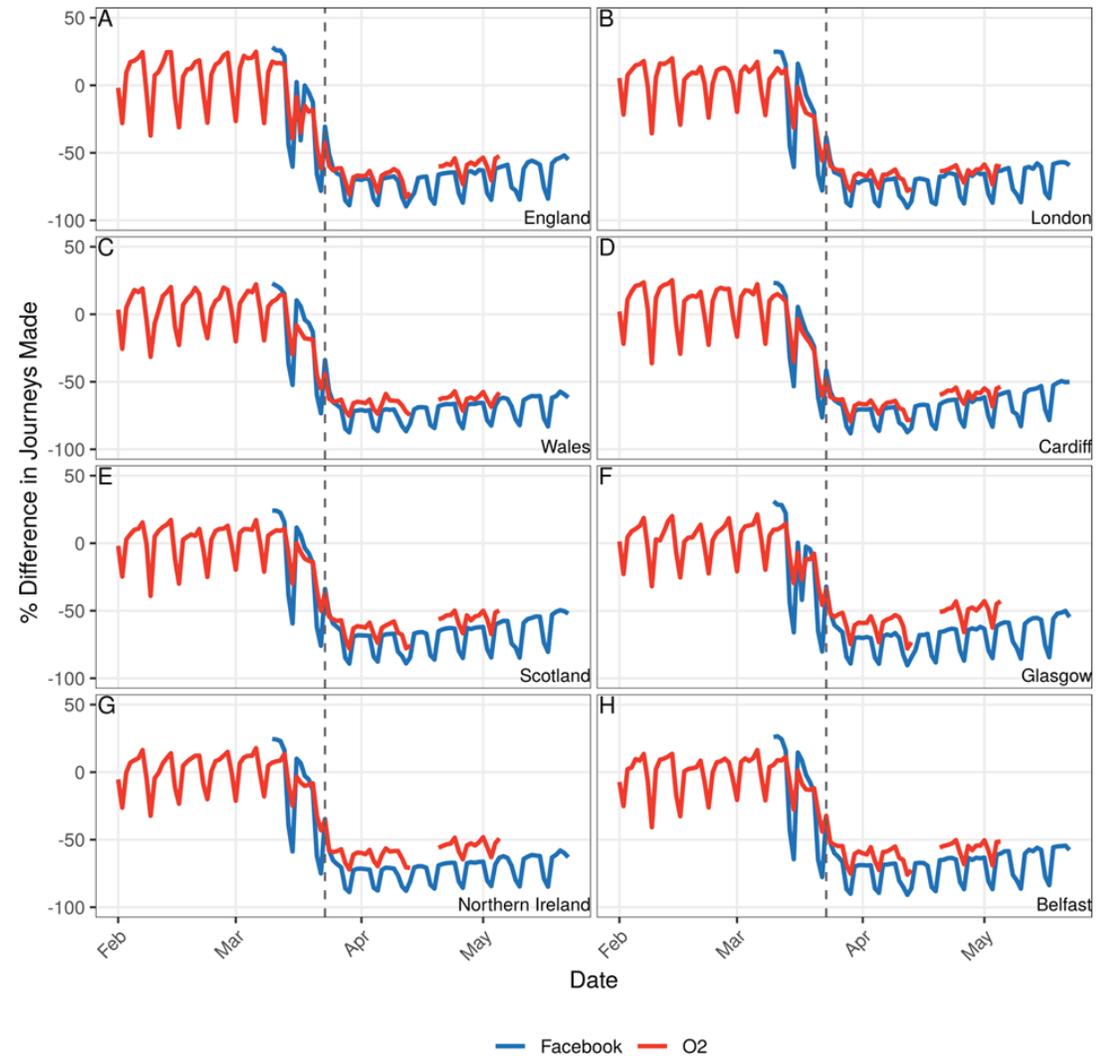
Maybe get some data...?

# Mobility data during the COVID-19 pandemic

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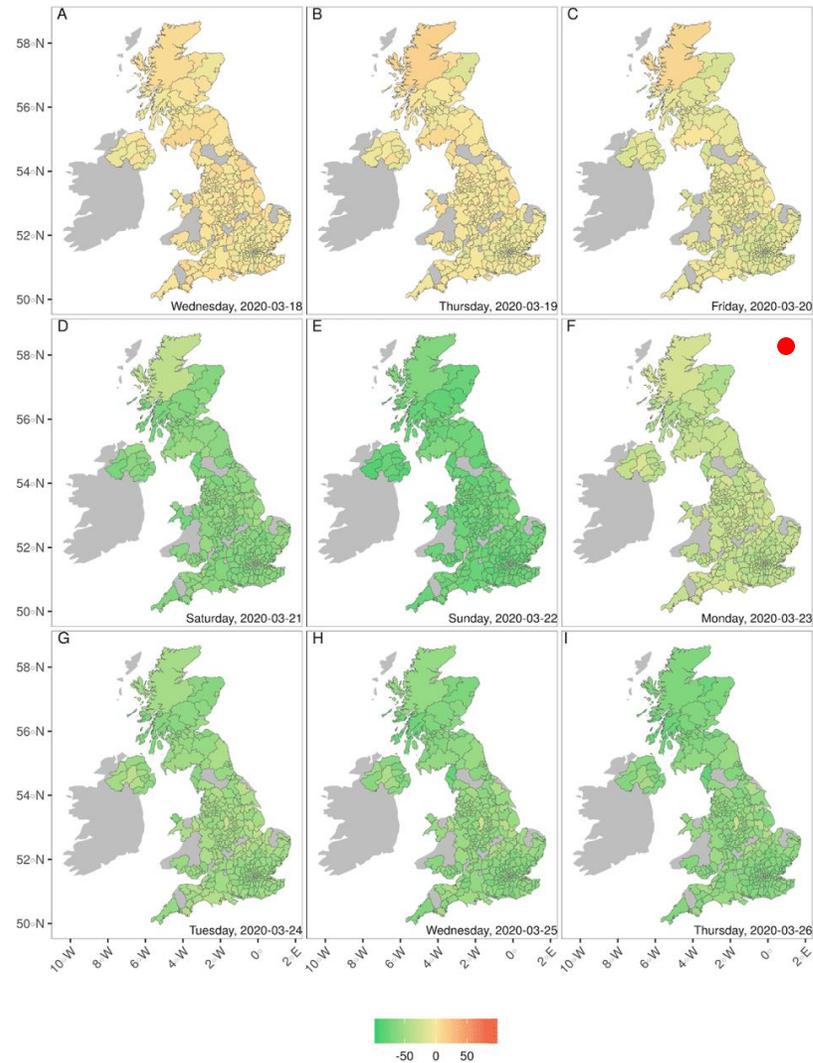
Figure 2. Consistent changes in mobility observed between Facebook data and mobile phone data.

- Corroborating trends
- Data not perfect from either source
- Confident to move forward with only Facebook



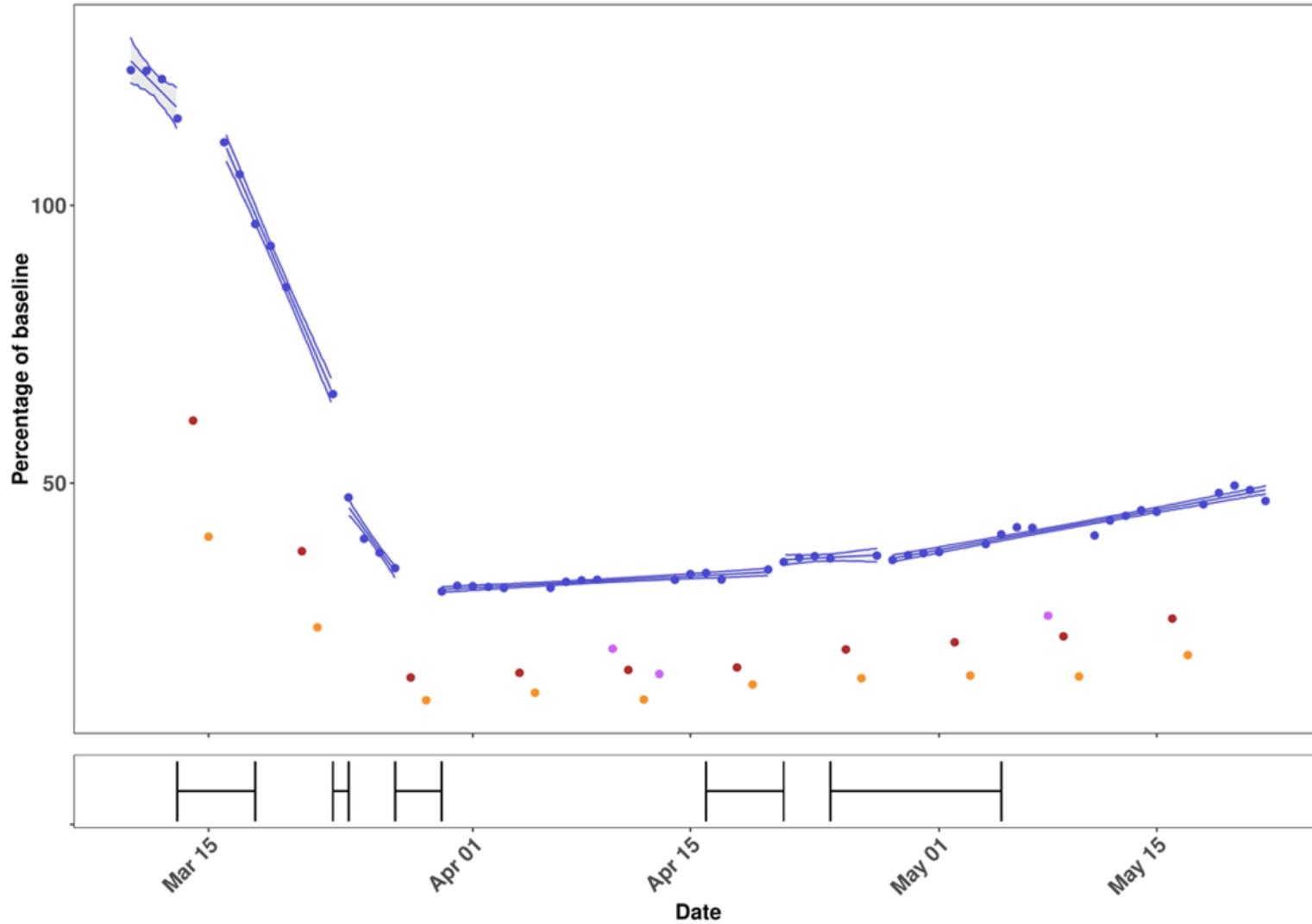
- 16<sup>th</sup> March:  
suggested lockdown
- 20<sup>th</sup> March:  
Schools, shops, hospitality shut down
- 23<sup>rd</sup> March:  
lockdown announced  
leave home once per day for exercise and for essentials
- 10<sup>th</sup> May:  
First relaxation of measures

Figure 1.



- 16<sup>th</sup> March:  
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- 20<sup>th</sup> March:  
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Figure 3. Fit of a segmented-linear model with 5 breakpoints to Facebook data



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leave home once per day for exercise and for essentials
- 10<sup>th</sup> May: First relaxation of measures



# Anonymised and aggregated crowd level mobility data from mobile phones suggests that initial compliance with COVID-19 social distancing interventions was high and geographically consistent across the UK [version 1; peer review: 2 approved]

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