

Infection modelling from CO₂ measurements

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Before the 2020-2021 academic year:

What role do schools play in COVID-19 transmission ?

Can the risk of airborne transmission be estimated ?

What is the effect of seasons ?

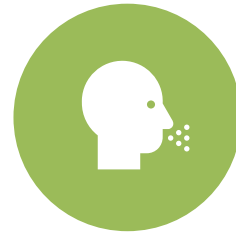
COVID-19 transmission routes

CO-TRACE

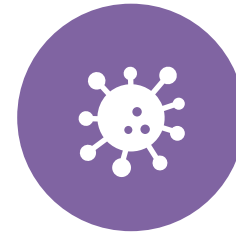
Healthy schools through air-quality science



CONTACT OR
TOUCH



DROPLET OR
SPRAY



AEROSOL OR
AIRBORNE

- Focus on far-field airborne transmission.
- Small infected respiratory droplets and aerosols remain suspended.
- Mixed and transported by ventilation.

Assessing the risk of airborne infection

Wells-Riley for steady state:

$$P_I = 1 - \exp\left(-\frac{Iqpt}{Q}\right)$$

- q : quanta generation rate
- I : number of infected people
- p : pulmonary ventilation rate
- Q : room ventilation rate
- t : exposure time

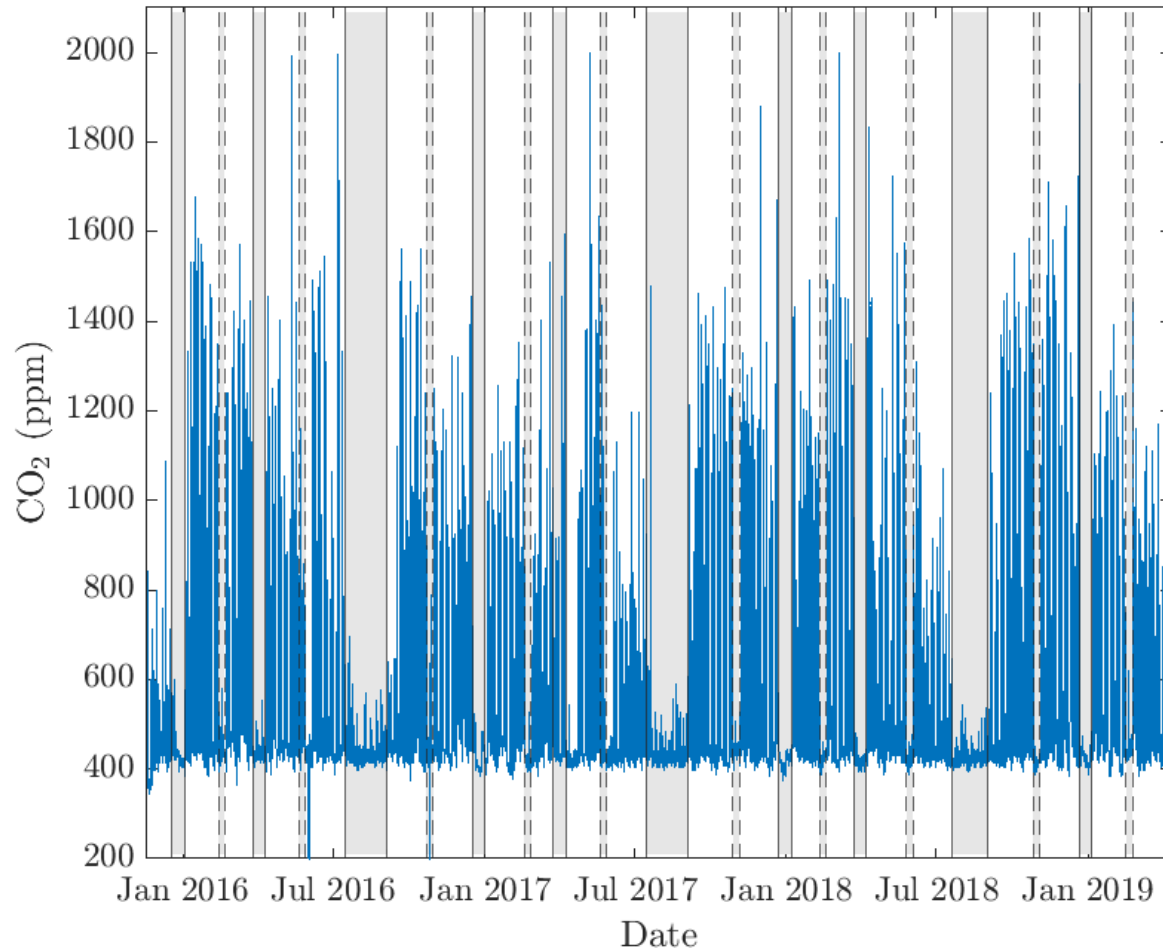
- Number of infectious airborne particle required to infect someone
- Varies with disease, individual and activity levels
- Has to be estimated from the analysis of outbreaks

Rudnick & Milton (2003):

$$P = 1 - \exp\left[\frac{I}{N} q \int_0^T f(t) dt\right]$$

- N : number of occupants
- f : rebreathed fraction

CO₂ measurements



- Rebreathed fraction $f = \frac{C - C_{out}}{C_a}$
- C : measured CO₂.
- C_{out} : ambient CO₂ (average between 05:00 and 06:00).
- C_a : CO₂ in the exhaled breath (=37,500 ppm).
- Measurements obtained for 45 classrooms in England⁽¹⁾

School	Type	County	Rooms	Data span
1	Primary	Yorkshire	22	Nov/15 – Mar/19
2	Secondary	Berkshire	1	Nov/19 – Mar/20
3	Primary	Somerset	1	May/17 – Mar/18
4	Primary	Surrey	1	Dec/17 – May/18
5	Primary	Cambridgeshire	2	Aug/17 – Jan/18
6	Primary	Not disclosed	3	Dec/18 – Feb/19
7	Primary	Essex	4	Oct/16 – Dec/17
8	Secondary	Kent	1	Mar/18 – Apr/19
9	Primary	Surrey	4	Aug/17 – Aug/18
10	Primary	Kent	1	Aug/17 – Jul/18
11	Secondary	Hertfordshire	5	Sep/18 – Mar/20

(1) DATA provided by Monodraught, with the assistance of Nick Hopper and Nyssa Hayes, and by the K2n platform, with the assistance of Professor Ian Knight.

Airborne infection risk for variable occupancy

Rudnick and Milton (2003) for monitored transient environmental conditions:

$$P = 1 - \exp \left[\frac{I}{N} q \int_0^T f(t) dt \right]$$

But occupancy N will vary.

If we assume every occupant is equally likely to be infected:

$$P = 1 - \exp \left[q \int_0^T \frac{I(t)}{N(t)} f(t) dt \right]$$

Number of secondary infections

- Adapted from Rudnick & Milton (2003), likelihood of infection when the space is occupied (0 otherwise):

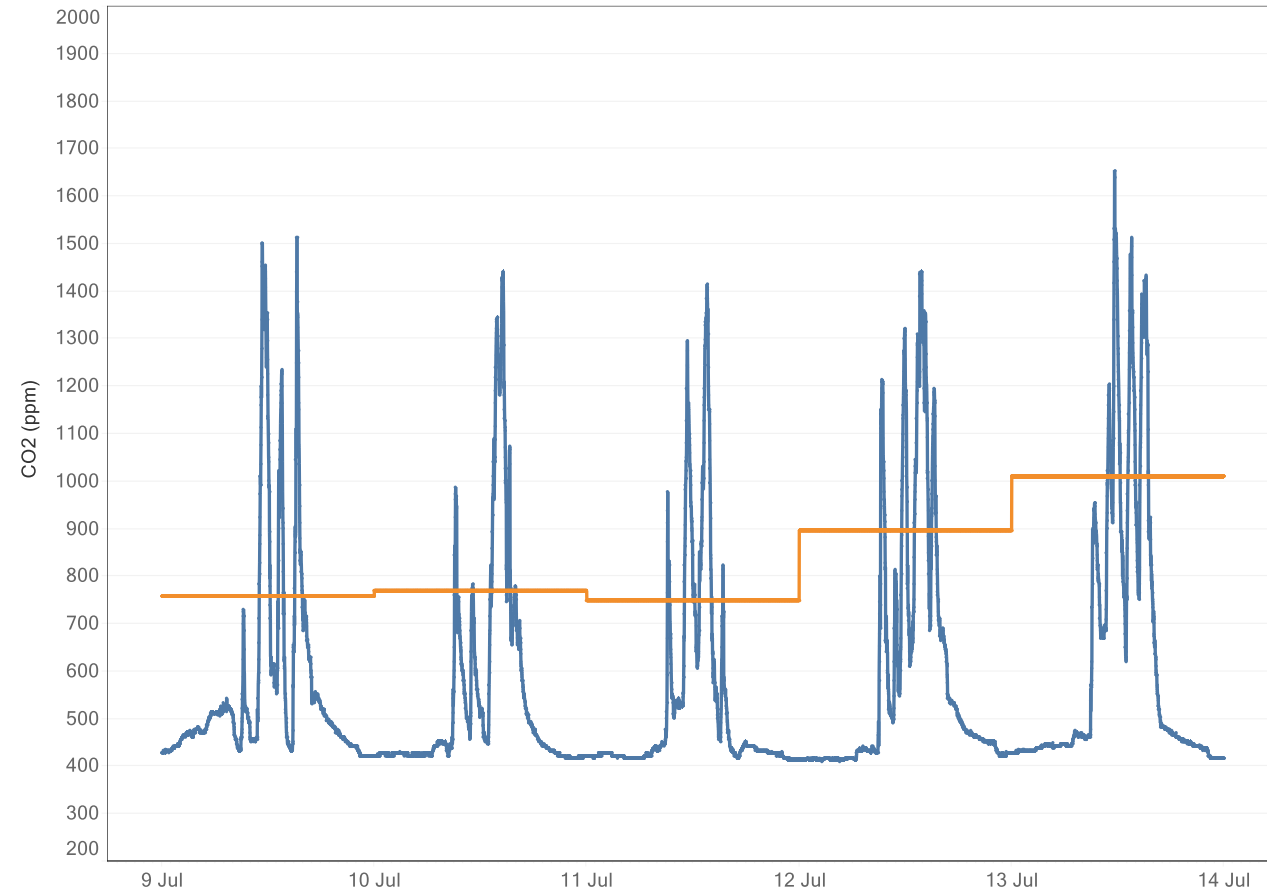
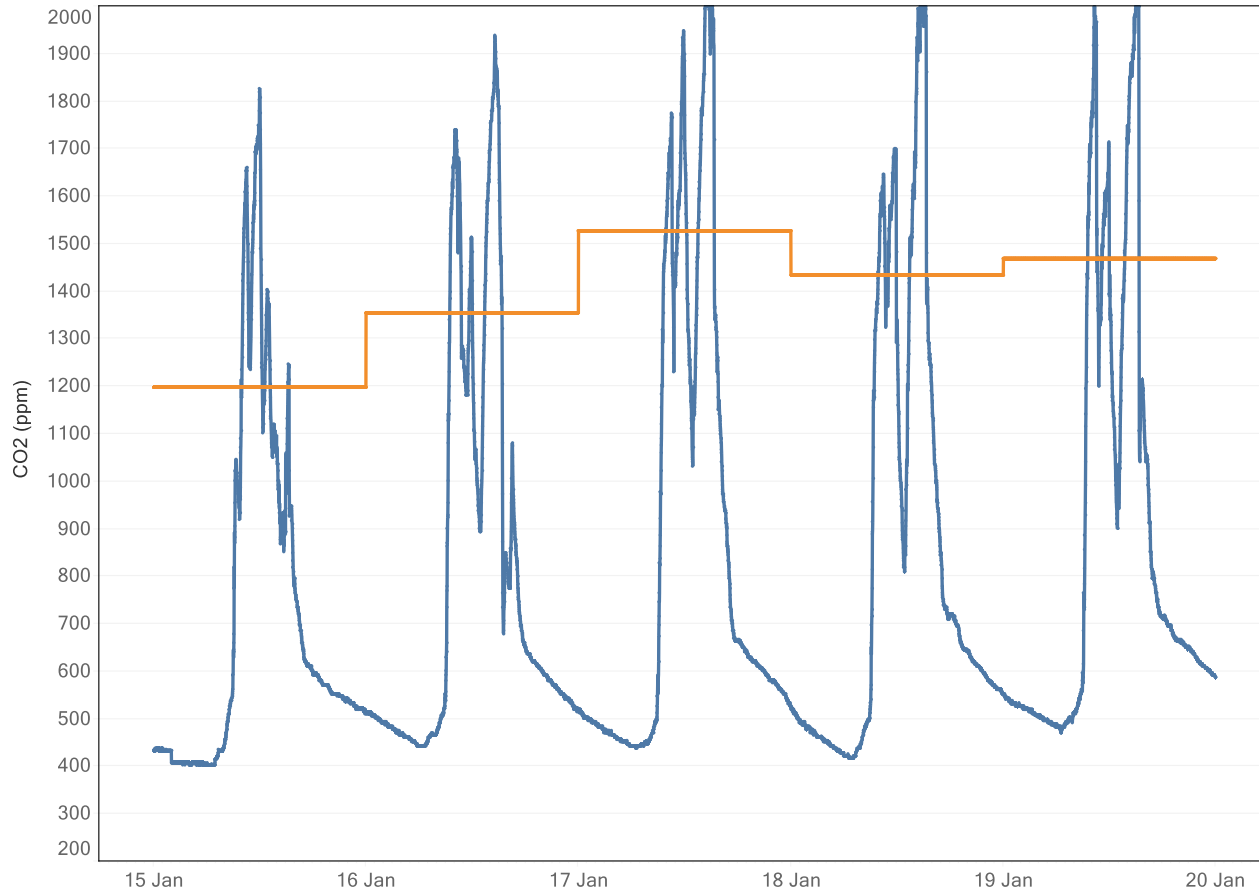
$$P_A = 1 - \exp\left(-\int_0^T \frac{1}{N(t)} f q dt\right)$$

- N : total number of occupants (32 in a UK classroom)
- q : quanta generation rate (1 quanta/hr from Buonanno *et al.*, 2020)
- f : rebreathed fraction
- T : exposure time (5 weekdays)

Number of secondary infections: $S_I = (N - 1)P_A$

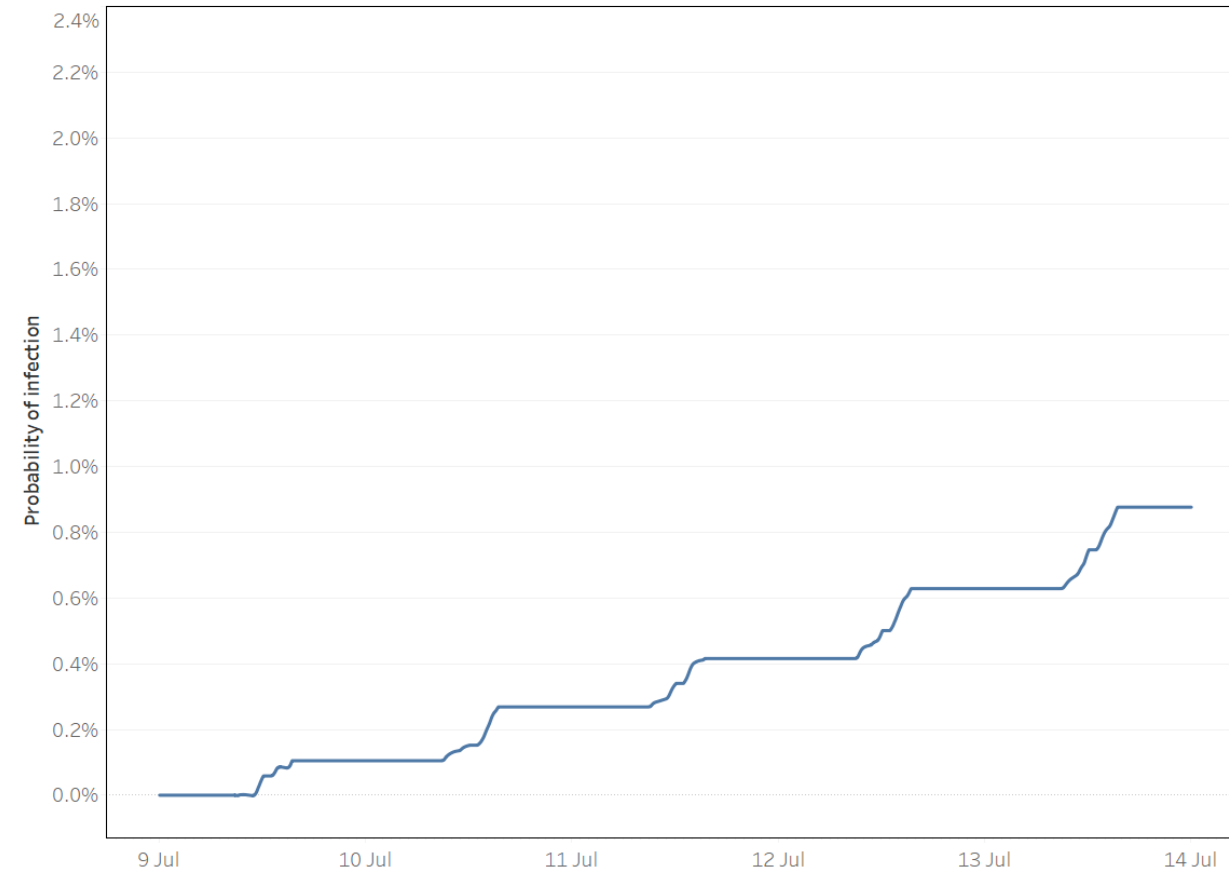
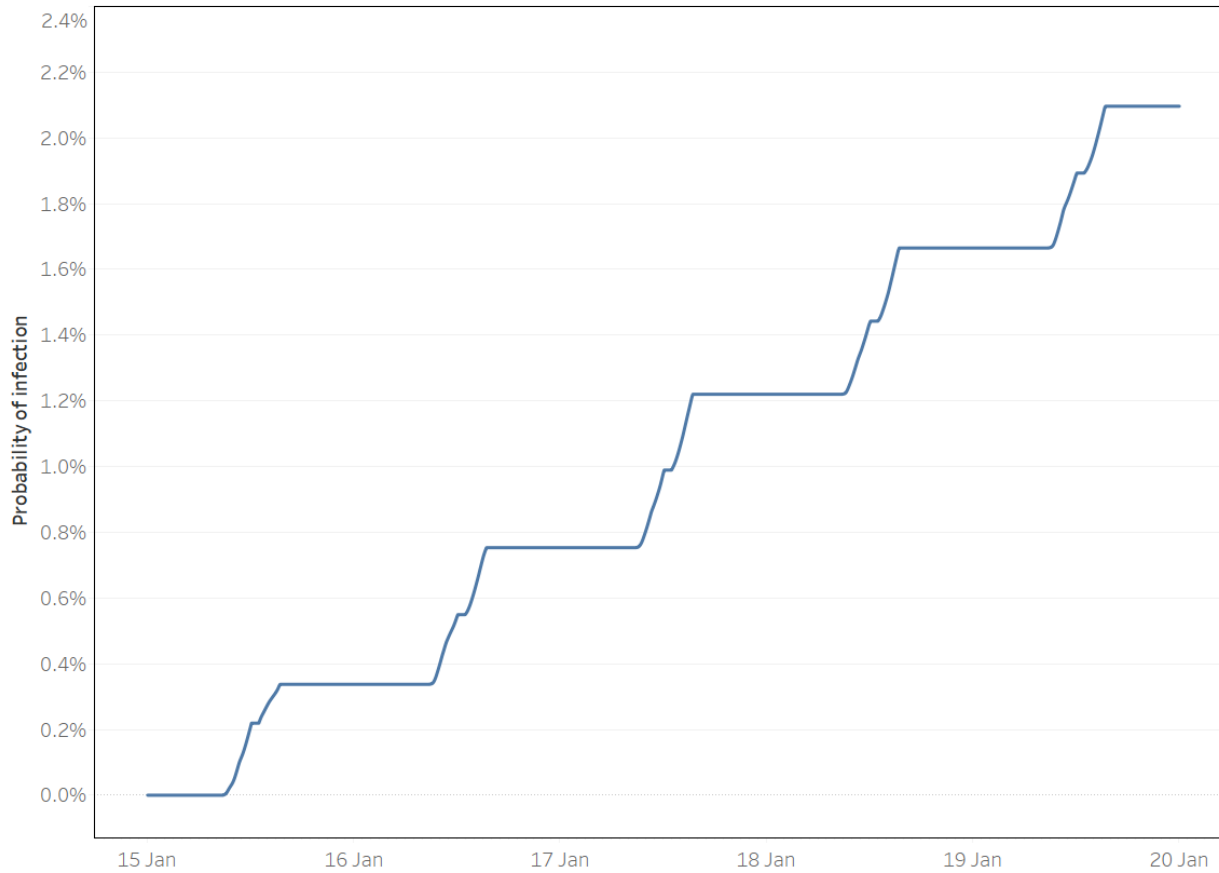
Example over a week (January and July 2018)

CO₂ variations in a given classroom. Daily average is shown in orange.



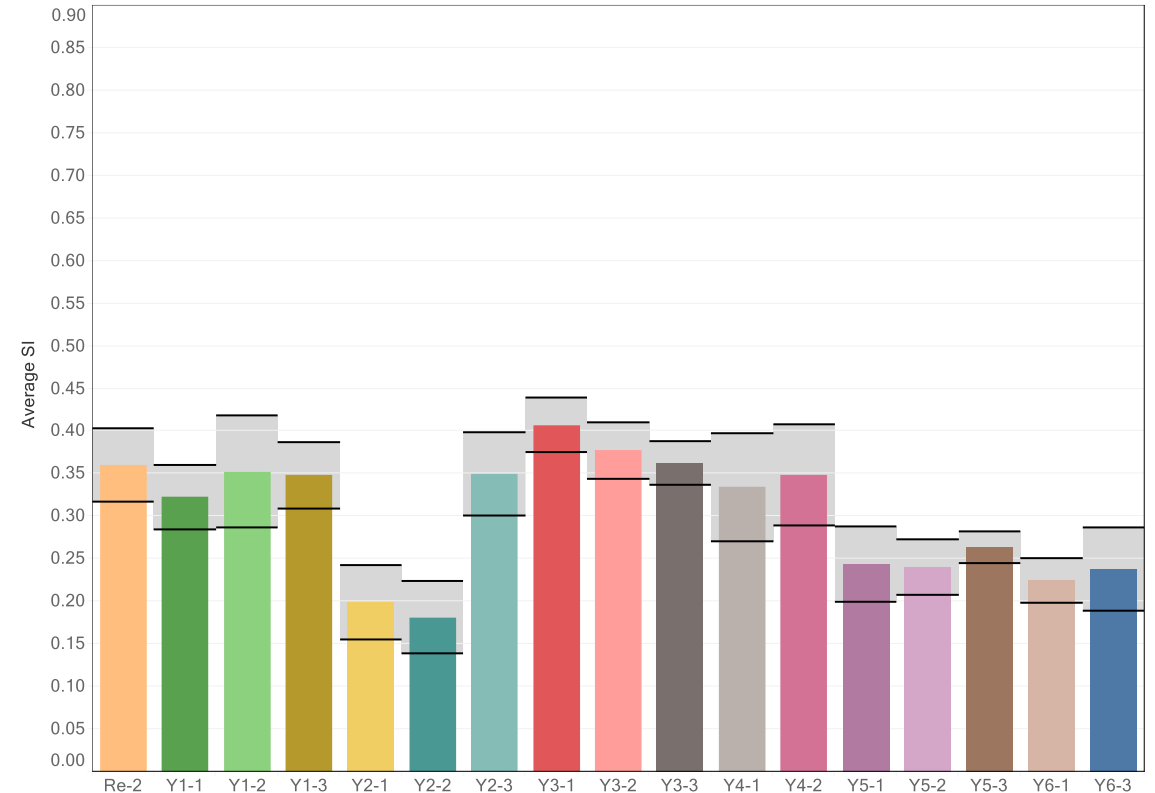
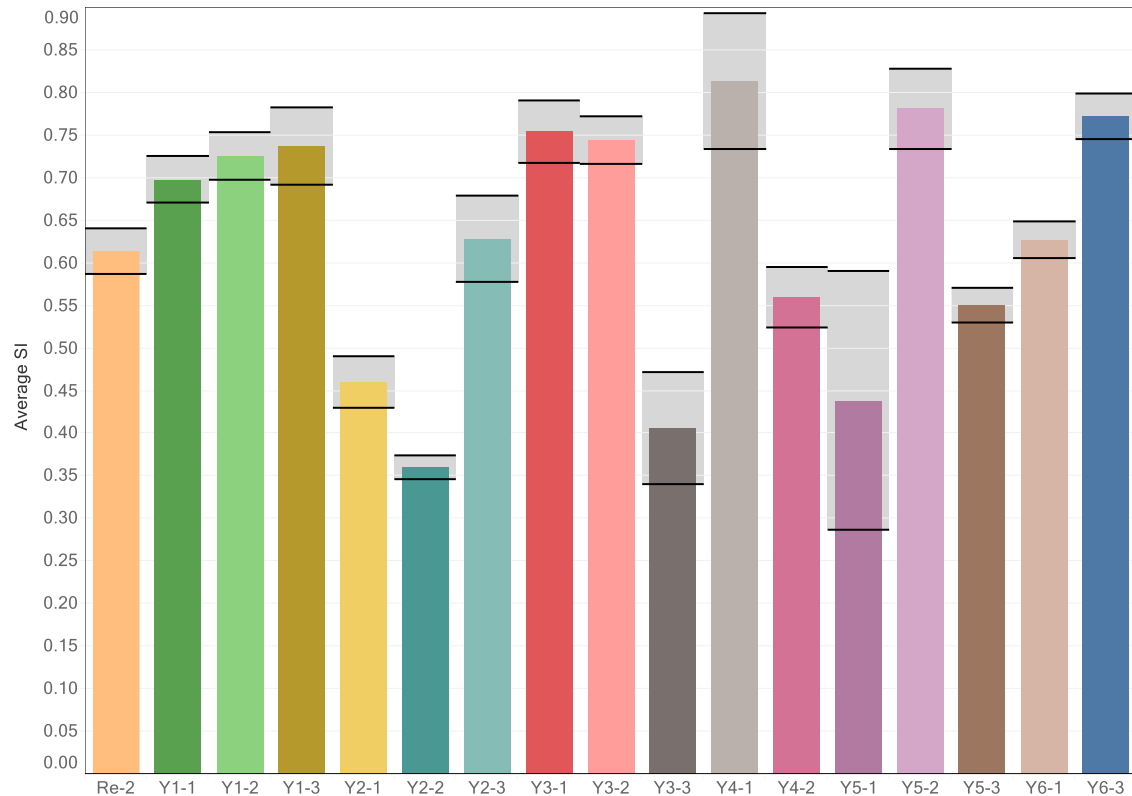
Example over a week (January and July 2018)

Calculated probability of infection in a given classroom.



Variations within a school

Classrooms within the same building and supplied with the same ventilation system



Average number of secondary infections in each classroom in January (left) and July (right) 2018.

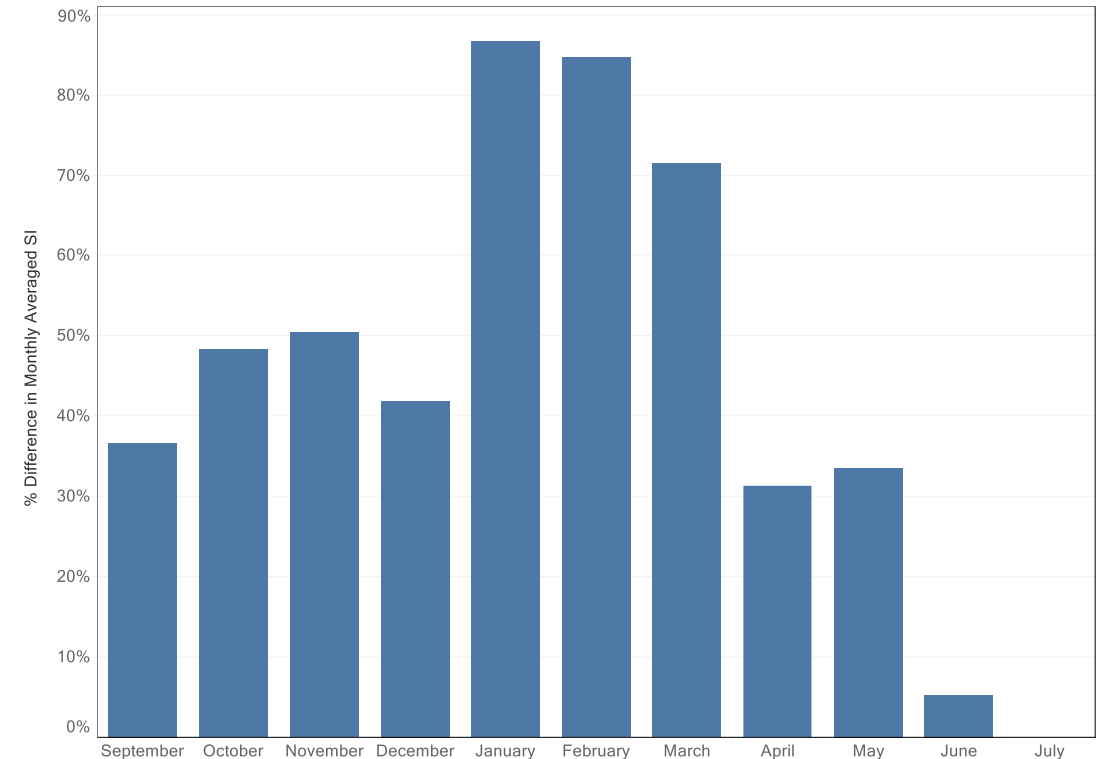
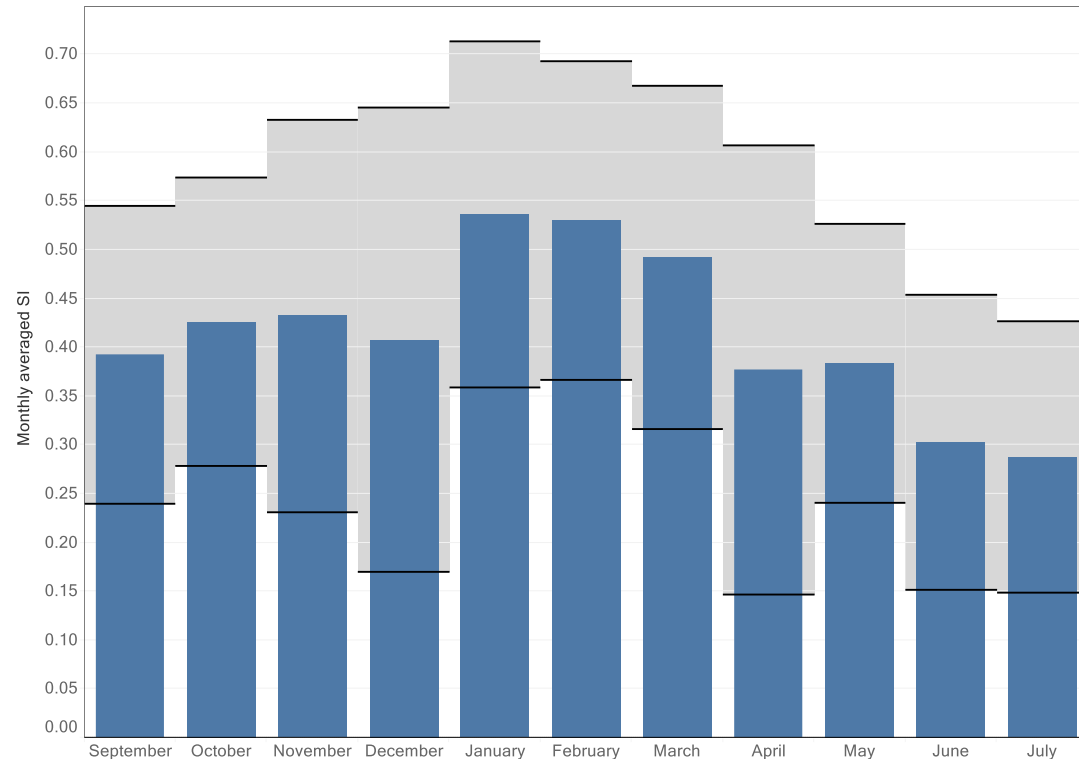
Standard deviations are shown in grey.

Seasonal variations

Due to changes in environmental conditions

CO-TRACE

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Absolute (left) and relative (right) monthly averaged number of secondary infections in all 45 classrooms over the period November 2015 to March 2020.

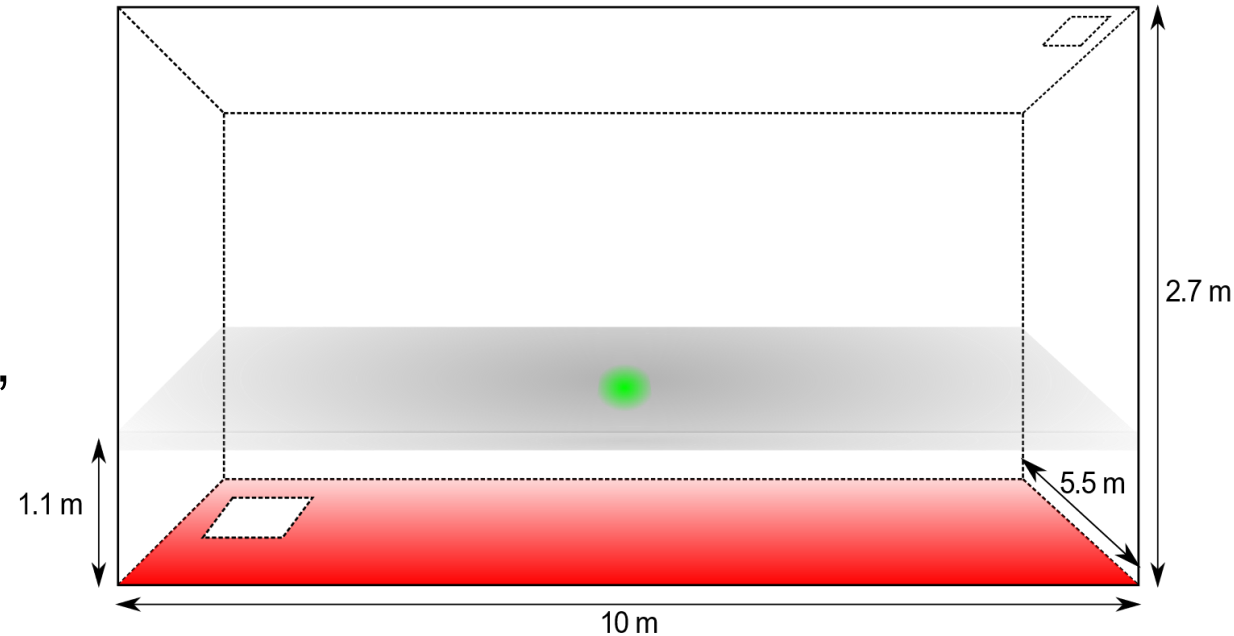
- More details here: Vouriot, C.V.M., Burrige, H.C., Noakes, C.J. and Linden, P.F., 2021. Seasonal variation in airborne infection risk in schools due to changes in ventilation inferred from monitored carbon dioxide. *Indoor Air*. <https://doi.org/10.1111/ina.12818>

Current work: How good a proxy is CO₂ ?

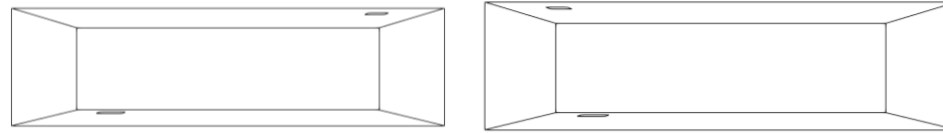
- OpenFOAM RANS simulations
- Primary school classroom (32 occupants)
- Naturally ventilated through high- and low-level openings
- In wintertime (ambient temperature 5°C)
- Distributed heat input of 6.2 kW at low-level, representative of people & heating required for a thermally comfortable classroom
- Passive scalars to represent CO₂ / infected breath at breathing height

→ How does CO₂ distribution vary within the room?

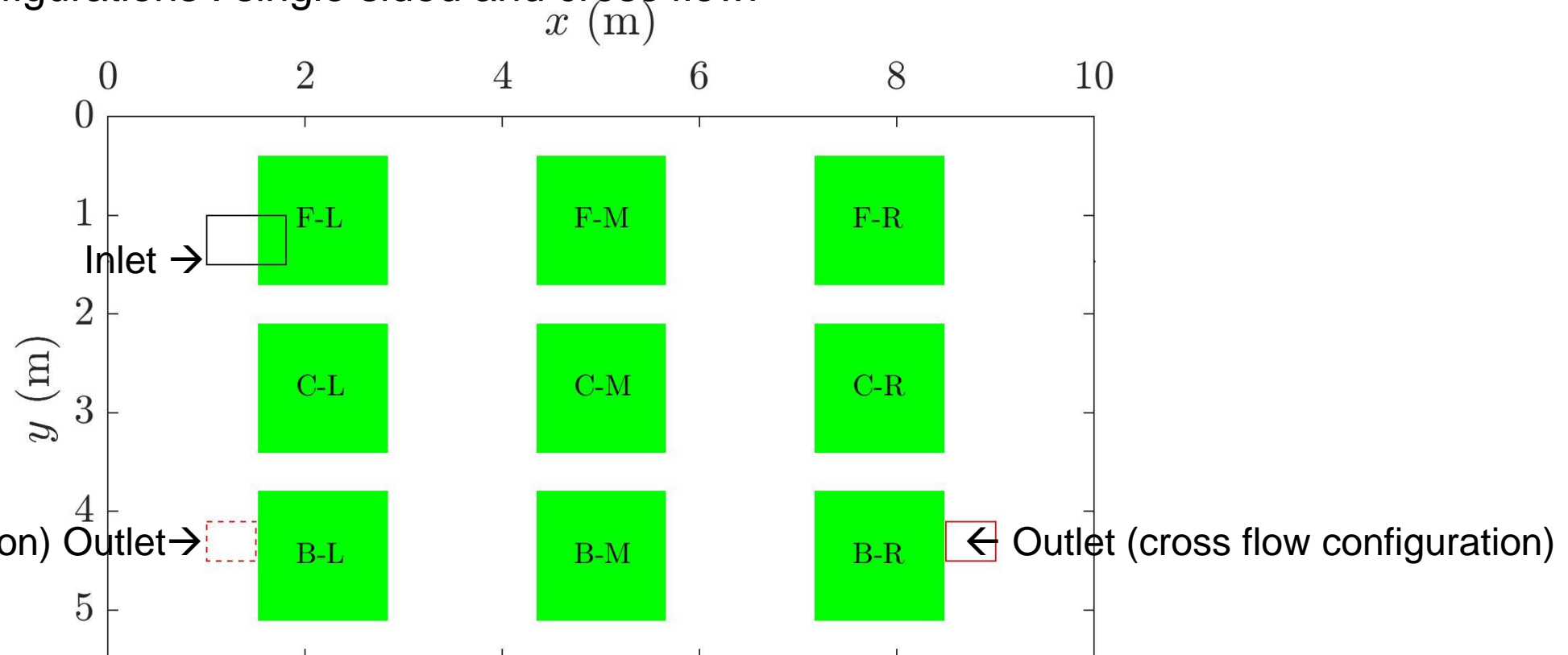
→ How does **far-field** exposure to infected breath change with source location ?



Set up overview



2 ventilation configurations : single sided and cross flow.

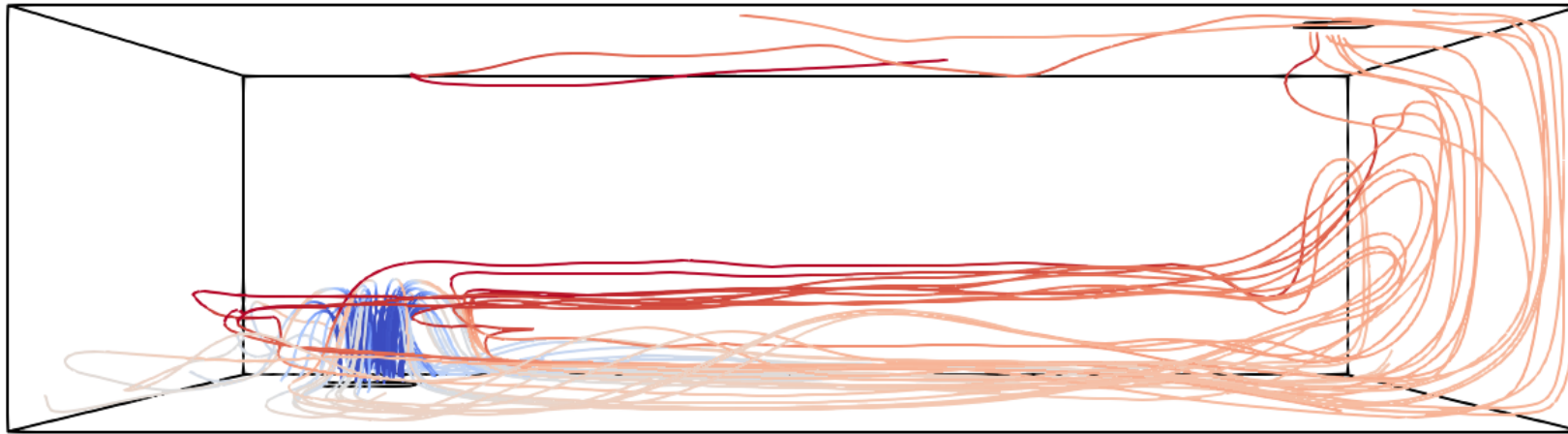


At the breathing height 10 scalars are introduced: 9 infected breath scalars + 1 background scalar. Overall gives the CO₂ distribution.

Comparing ventilation set ups

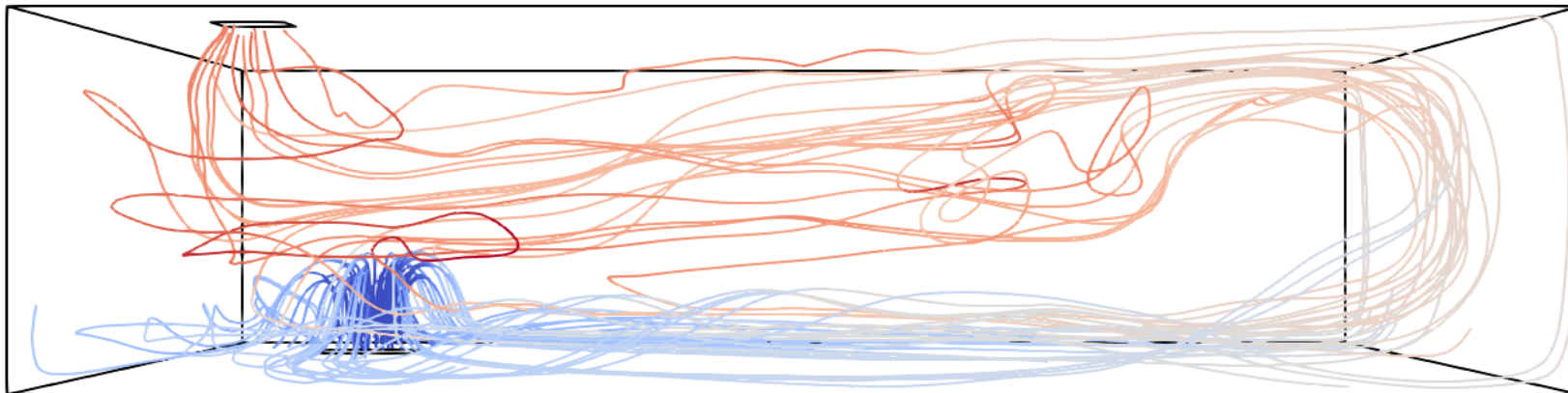
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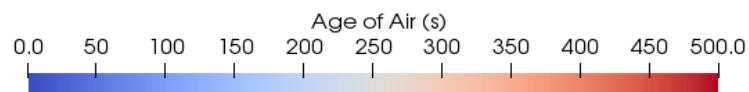


Cross flow (top)
Single sided (bottom)

CO₂ room average 822
ppm
8.3 L/s/person



CO₂ room average 828
ppm
8.3 L/s/person



Current work

CO-TRACE

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How representative is a single CO₂ measurement ?

Where should the sensors be placed ?

Is CO₂ a good proxy for **far-field** exposure to infected breath ?

How does this change with the location of infected breath?