

Supplementary Information for: Combining fine-scale social contact data with epidemic modelling reveals interactions between contact tracing, quarantine, testing and physical distancing for controlling COVID-19

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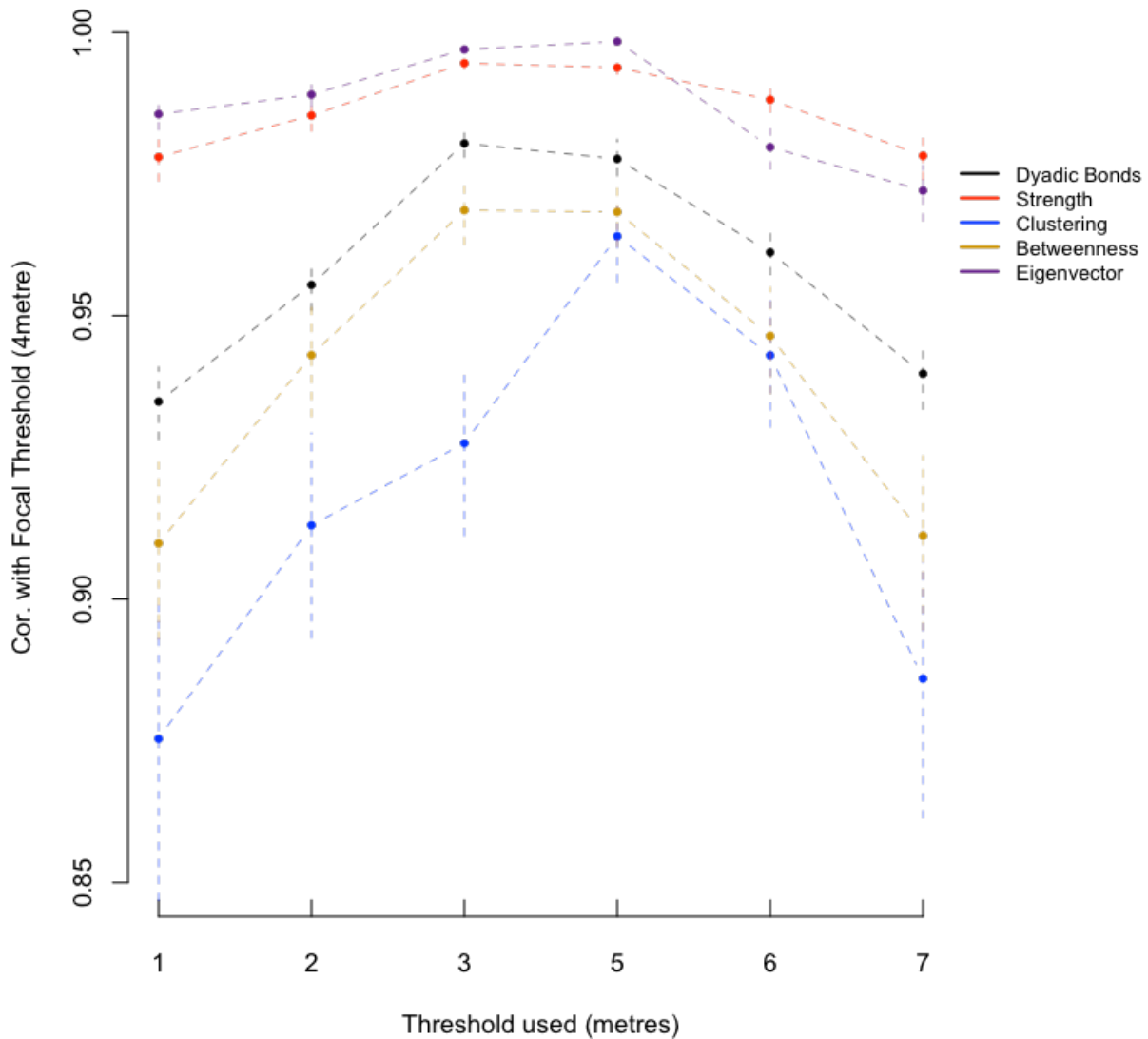
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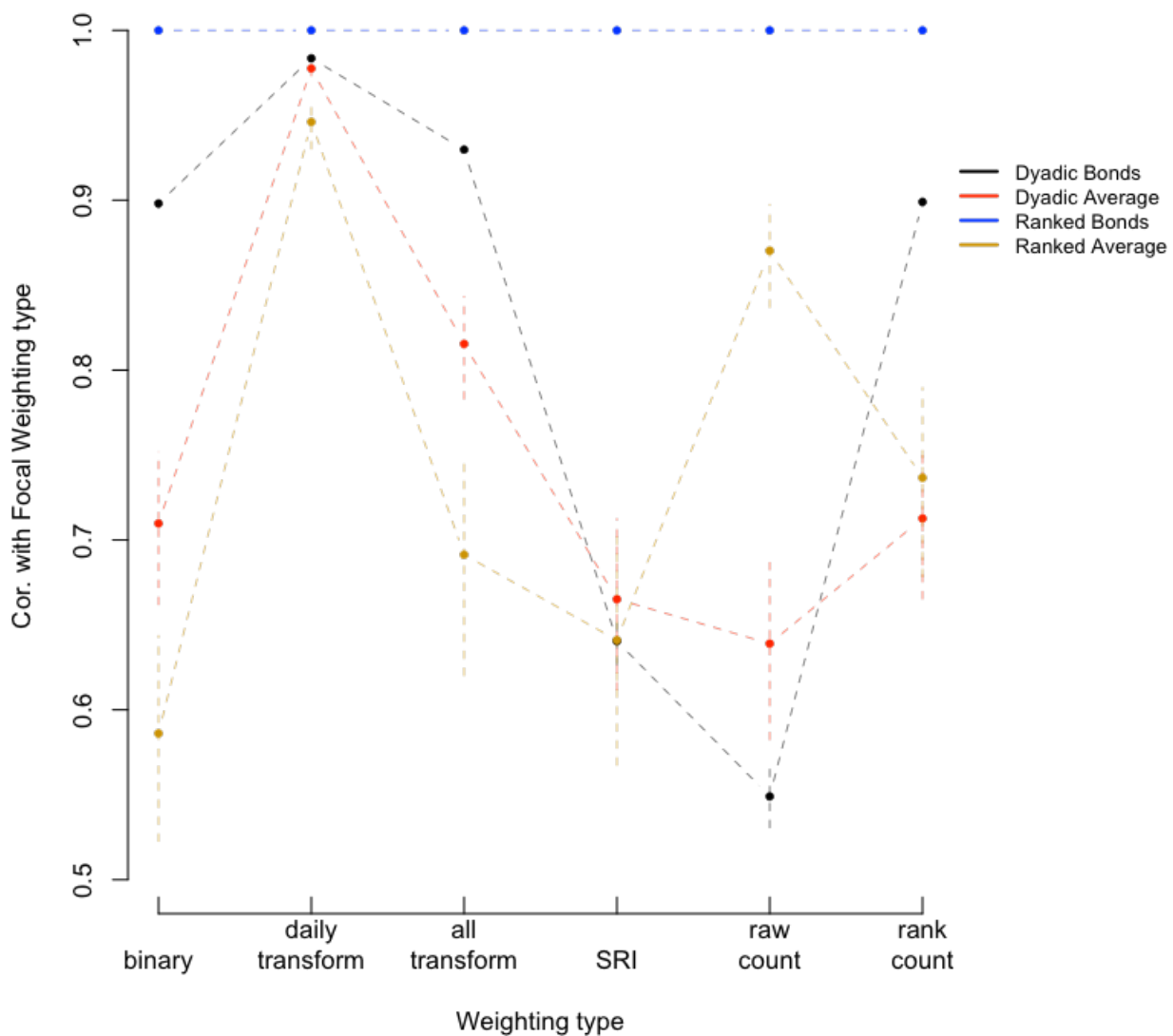
CMMID COVID-19 working group members (order selected at random): Mark Jit, Katherine E. Atkins, Samuel Clifford, C Julian Villabona-Arenas, Sophie R Meakin, Charlie Diamond, Nikos I Bosse, James D Munday, Kiesha Prem, Anna M Foss, Emily S Nightingale, Kevin van Zandvoort, Nicholas G. Davies, Hamish P Gibbs, Graham Medley, Amy Gimma, Stefan Flasche, David Simons, Megan Auzenberg, Timothy W Russell, Billy J Quilty, Eleanor M Rees, Quentin J Leclerc, W John Edmunds, Sebastian Funk, Rein M G J Houben, Gwenan M Knight, Sam Abbott, Fiona Yueqian Sun, Rachel Lowe, Damien C Tully, Simon R Procter, Christopher I Jarvis, Akira Endo,

Table S1. Parameter values for the epidemic model. Numbers given for sampled parameters are means and standard deviations, or medians and interquartile ranges, and default parameter settings for the scenario models are highlighted in bold.

Parameter	Assumed value(s)	Details and references
<i>Sampled</i>		
Incubation period	5.8 days (2.6)	9,29
Serial interval	Location = incubation period For post-symptomatic transmission, slant = ∞ , scale = 2 For presymptomatic transmission, slant = $-\infty$, scale = incubation period.	Based on data in ⁹
Delay from onset/tracing to isolation, and from isolation to testing	1 day (0.4-1.9) days ('short') 3.5 days (2.8-5.2) days ('medium')	Assumed (short) and ³⁰ (medium)
<i>Fixed</i>		
Initial cases	1 , 5	Assumed
Scaling parameter (and corresponding empirical estimate of the reproduction number R_0)	0.5 (2), 0.8 (2.8) , 2 (3.5)	³¹
Percentage asymptomatic individuals	20%, 40%	¹²
Infectiousness of asymptomatic individuals	50% (relative, to symptomatic)	Assumed
Percentage individuals infectious pre-onset	20% , 40%	9,32
Outside infection rate	0.0001, 0.001 , 0.005, 0.01	Assumed
Percentage of contacts traced	30%, 60%, 90%	Assumed
Maximum number of tests	0, 5, 25, 50	Tested
Test false positive rate	0.02	²⁸
Test false negative rate	0.1	Based data from early infection stages in ²⁰

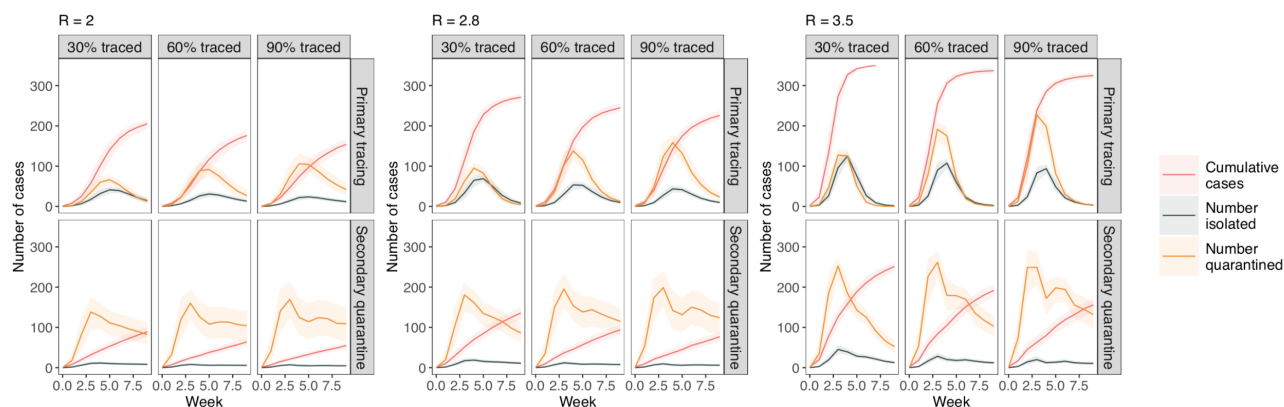


Extended Data Figure 1 Similarity between the focal 4 m network (weighted by number of days seen together) with the other potential threshold distances defined using different average distances within the 5 min intervals (1-7 m thresholds). We considered the correlation in dyadic social associations scores using Mantel tests, and examined the correlation in individuals' network metrics in terms of 'weighted degree' (number of contacts with others), 'clustering coefficient' (propensity for associates to also be associated with one another), 'betweenness' (propensity to bridge the network), and 'eigenvector centrality' (the social centrality of associates). The points show the correlation and the vertical lines show the 95% confidence around this estimate.

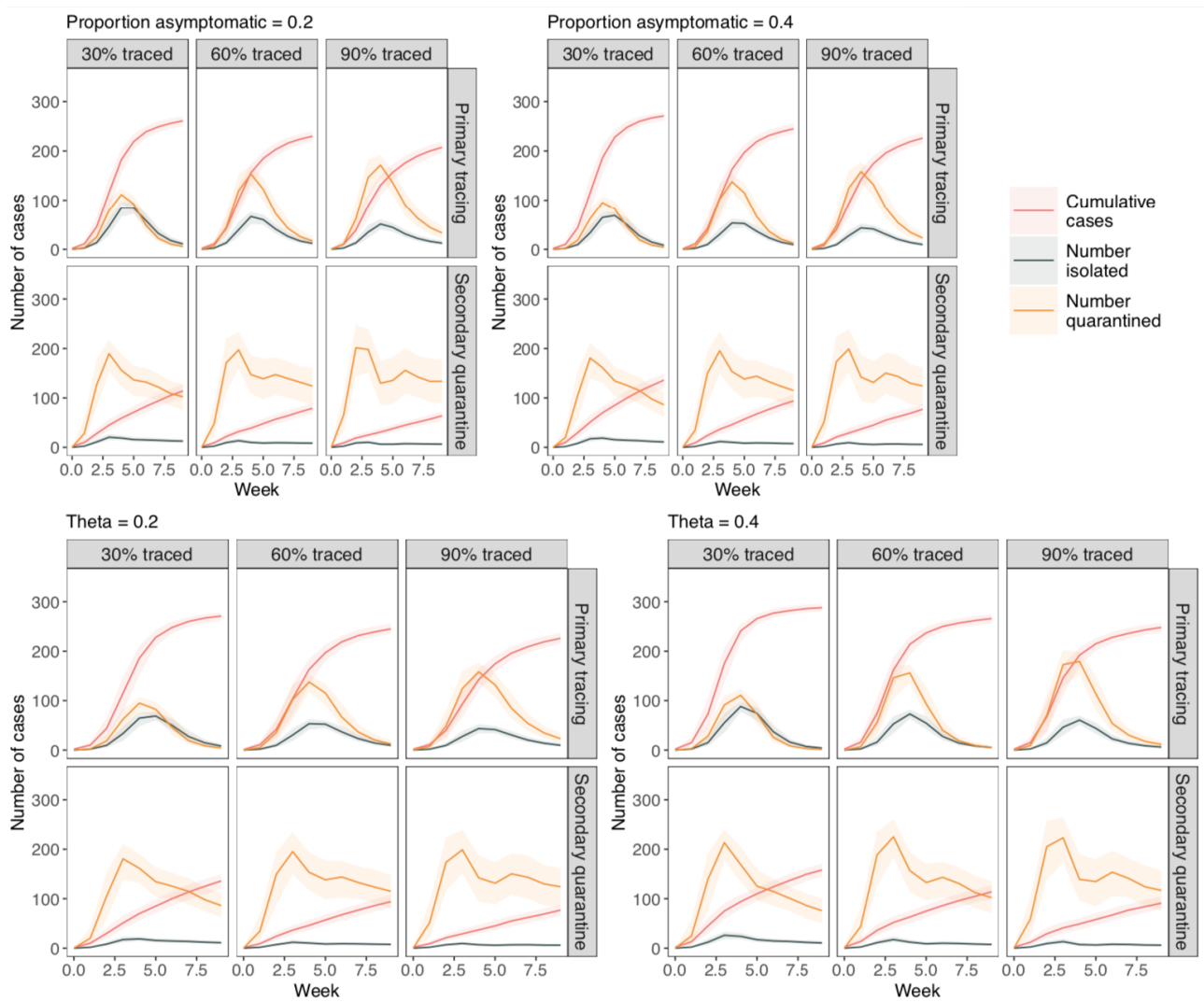


Extended Data Figure 2 Similarity between the focal weighted network (weighted by number of days seen together) with the other potential weighting options specified here as 'binary' (whether or not individuals had social contact over the three day period), 'daily transform' (sum of $1 - e^{\text{contacts}}$ calculated for each day, where contacts = 5 min interval together each day), 'all transform' ($1 - e^{\text{contacts}}$ where contacts = 5 min interval together over all of the time period), 'SRI' (the 'Simple Ratio Index' i.e. using the number of 5 min intervals each dyad was seen together but correcting for the amount of 5 min intervals both members of the dyad were seen in total), 'raw count' (the number of 5 min intervals each dyad was seen together), 'rank count' (the ranked number of 5 min intervals each dyad was seen together). We calculated the network correlations in dyadic social associations scores using Mantel tests (where 'Dyadic bonds' shows Pearson correlation and 'Ranked bonds' shows Spearman correlation), as well as the correlation in individuals' network

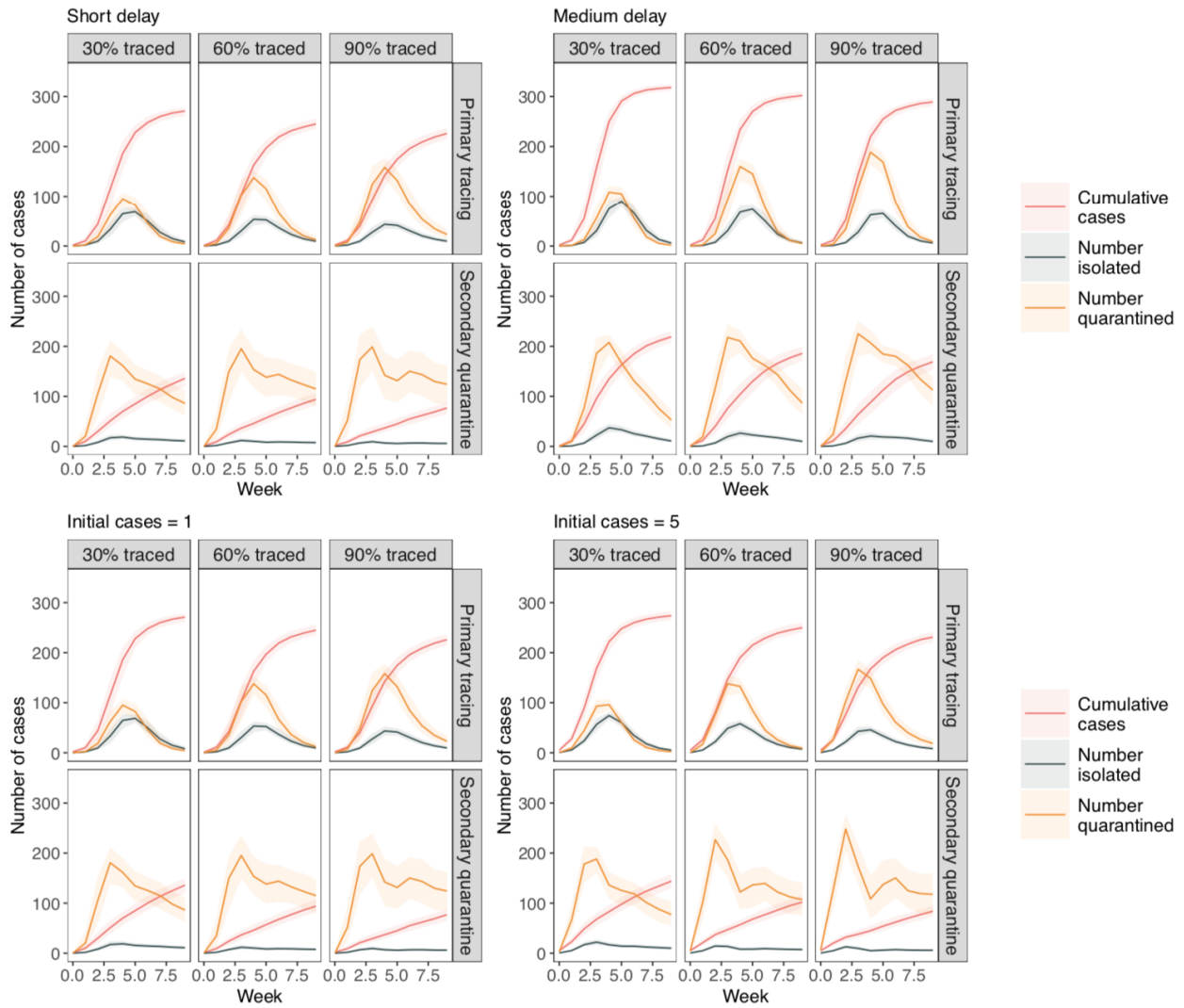
metrics in terms of their average bond strength to all those they held an edge to (where 'Dyadic Average' shows Pearson correlation and 'Ranked Average' shows Spearman correlation). The points show the correlation and the vertical lines show the 95% confidence around this estimate.



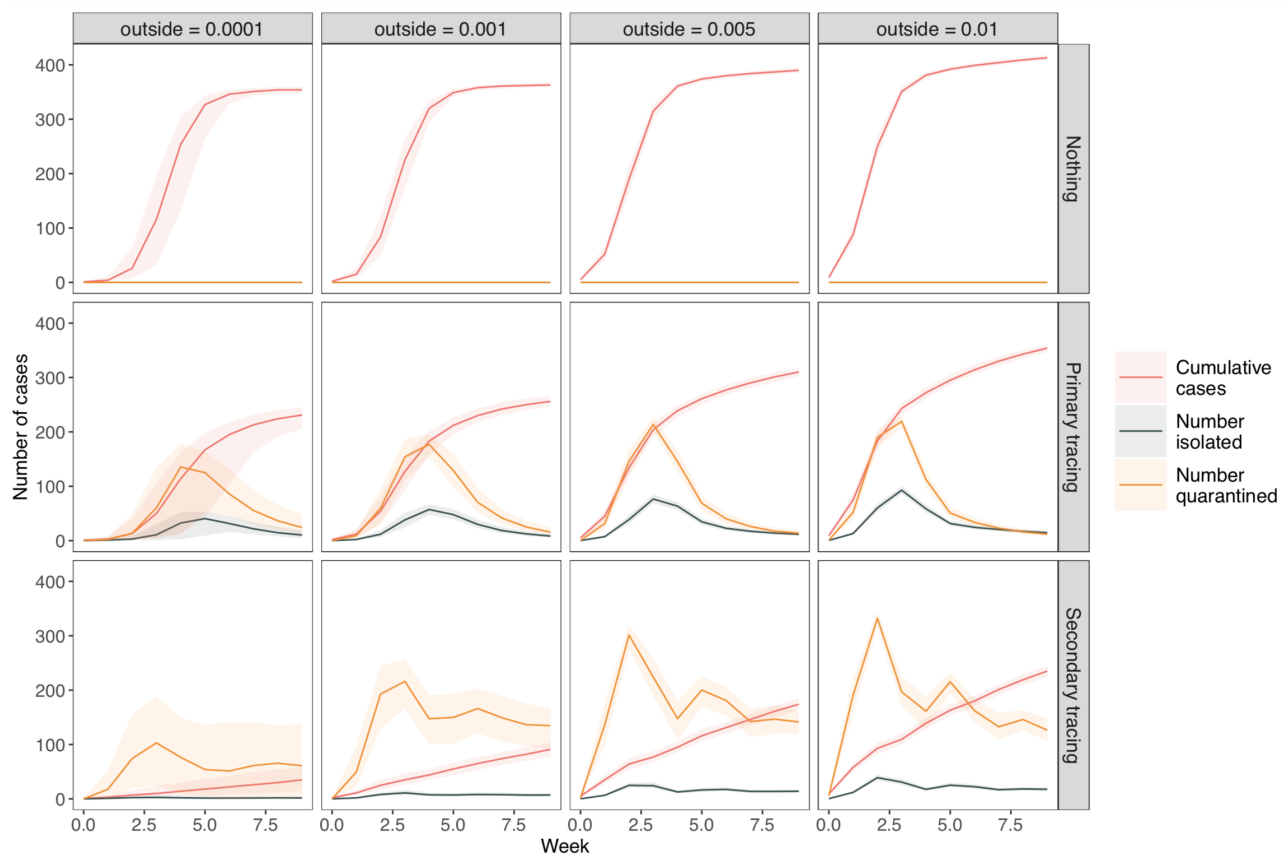
Extended Data Figure 3 Epidemic model predictions of outbreak size and number of people isolated/quarantined in relation to the basic reproduction number R . Lines and shaded areas represent median and interquartile range from 1000 simulations.



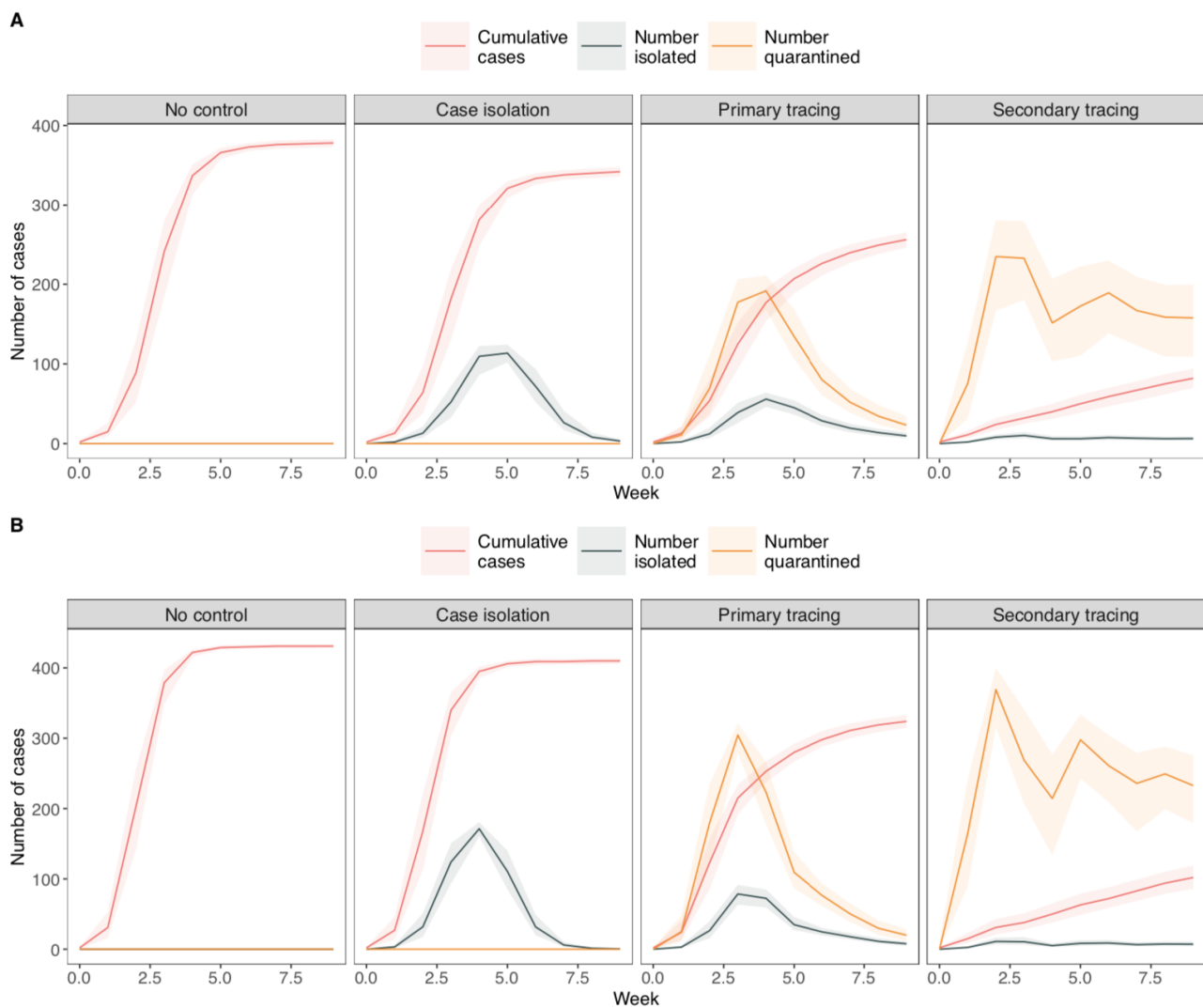
Extended Data Figure 4 Epidemic model predictions of outbreak size and number of people isolated/quarantined in relation to the proportion of asymptomatic cases, and the rate of presymptomatic transmission (theta). Lines and shaded areas represent median and interquartile range from 1000 simulations.



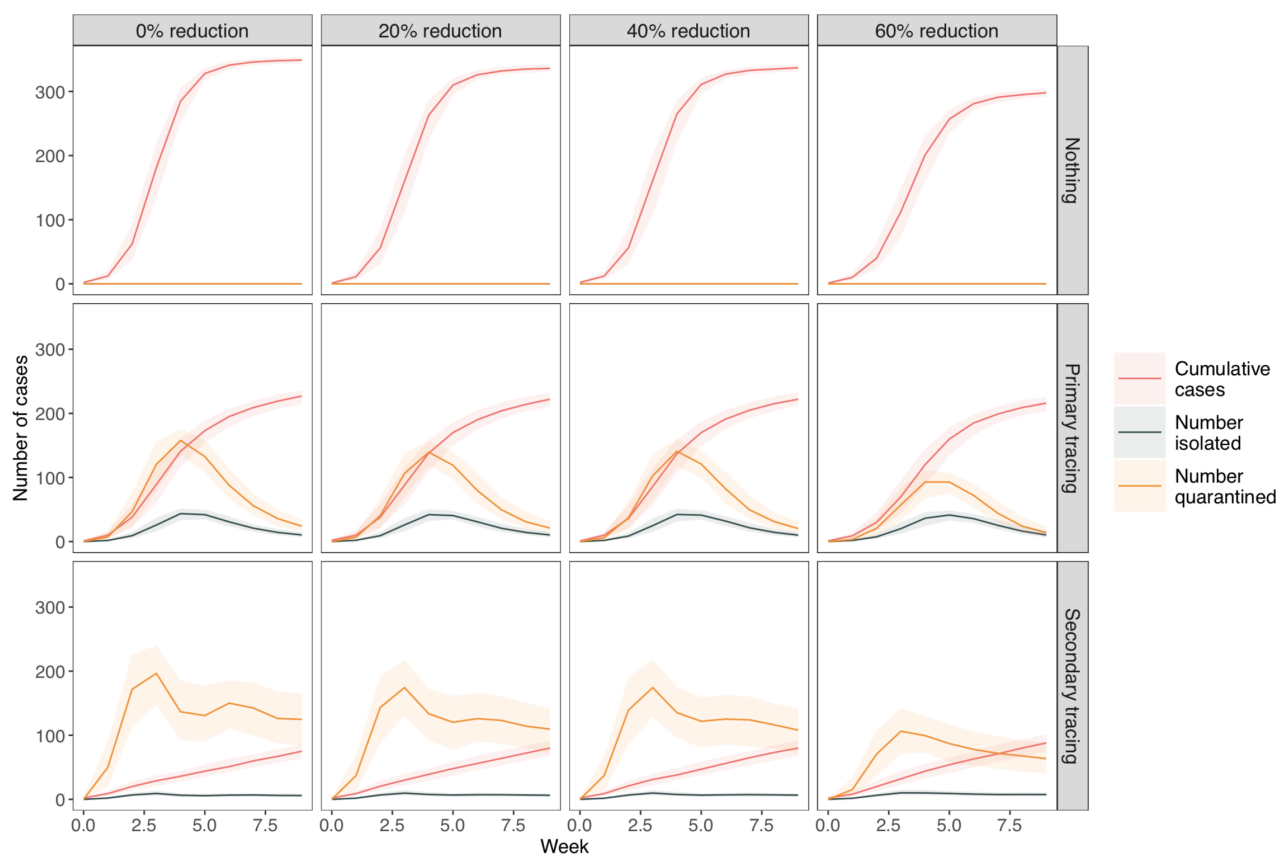
Extended Data Figure 5 Epidemic model predictions of outbreak size and number of people isolated/quarantined in relation to the delay between case onset/tracing and isolation/quarantine (see methods for details), and the number of initial cases. Lines and shaded areas represent median and interquartile range from 1000 simulations.



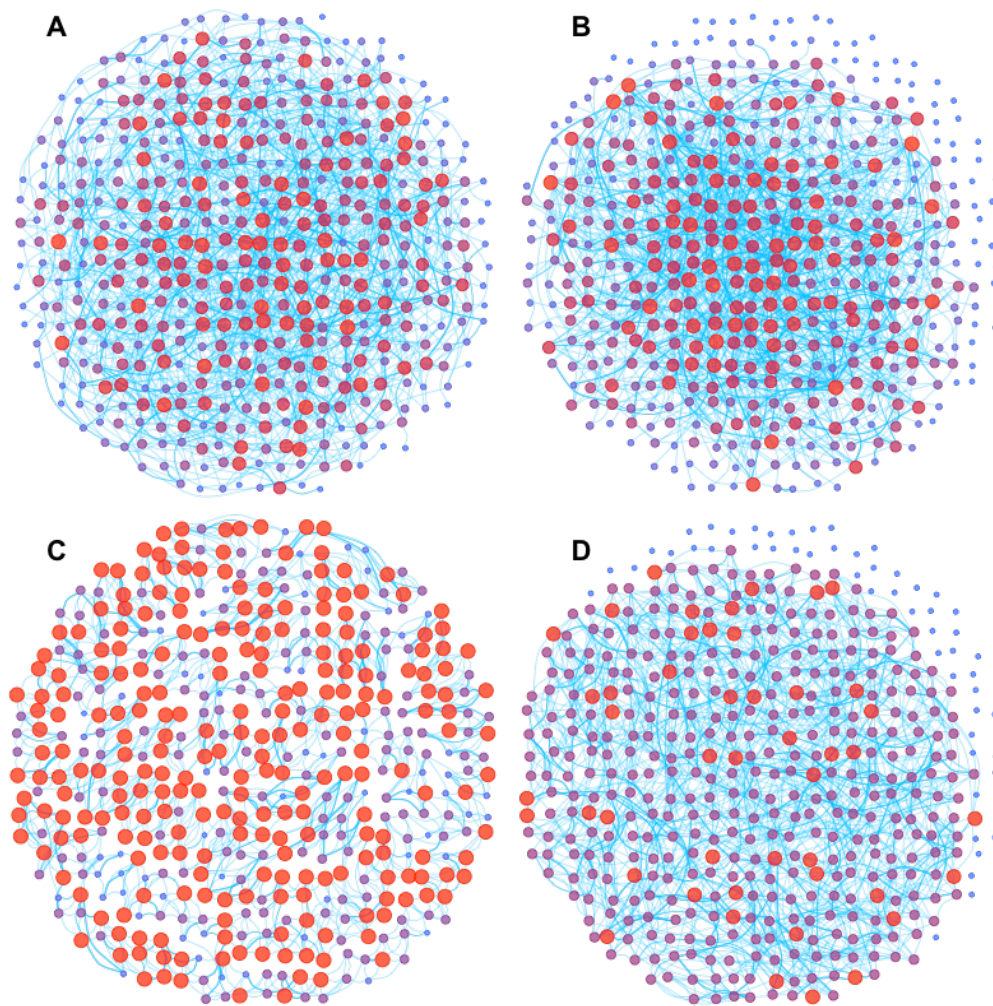
Extended Data Figure 6 Epidemic model predictions of outbreak size and number of people isolated/quarantined in relation to the outside infection rate into the Haslemere network. Outside infection rate is the probability that an individual is randomly infected on a given day (see methods for details). Lines and shaded areas represent median and interquartile range from 1000 simulations.



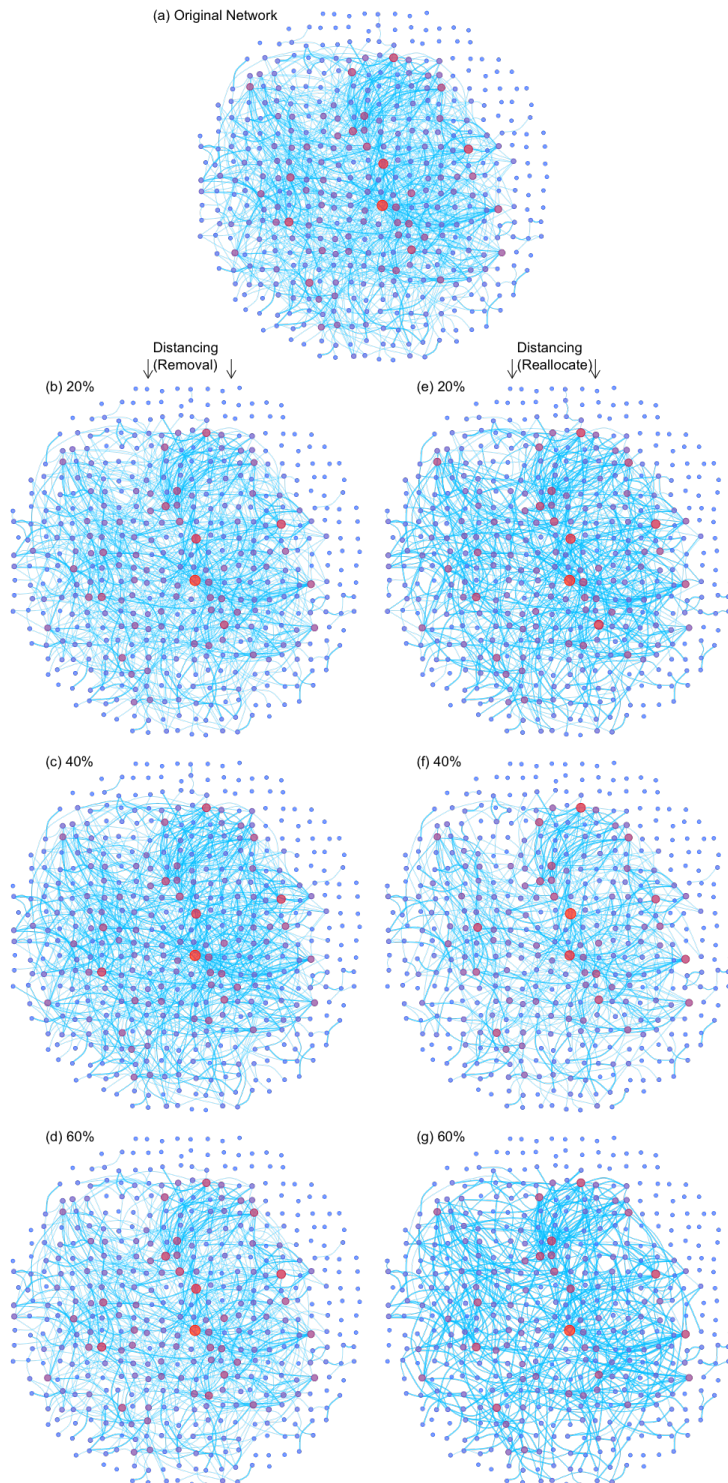
Extended Data Figure 7 Epidemic model predictions of outbreak size and number of people isolated/quarantined under different non-pharmaceutical intervention scenarios in the Haslemere network, with distance thresholds for contacts set at **A** 7 metres, and **B** 16 metres, whereby an increased threshold results in a more densely connected network. Colours represent the cumulative number of cases, number of people isolated per day, and number of people quarantined per day under each scenario. Lines and shaded areas represent median and interquartile range from 1000 simulations.



Extended Data Figure 8 Epidemic model predictions of outbreak size and number of people isolated, quarantined and tested under different levels of physical distancing in the Haslemere network, with physical distancing simulated using a reassignment method. The percentage reduction refers to the number of ‘weak links’ removed and reassigned (see methods and Fig. S2). Lines and shaded areas represent median and interquartile range from 1000 simulations.



Extended Data Figure 9 Graphical depiction of examples of the networks of social contact generated under the four different empirically parameterised null models. Number of unique contact partners is denoted by size and colour of nodes (large & red = central) with this standardised within each panel (max node size = 3x min node size). Each panel contains the same number of unique edges in total, and the strength of the edges (denoted by thickness) is also maintained. The panel order follows that of main text Figure 3, with **A** edge null, **B** degree null, **C** lattice null and **D** cluster null (see methods for details). Each network is organised in a fitted spring layout which is then rescaled into an equally-spaced filled circular format.



Extended Data Figure 10 Graphical depiction of examples of social networks under the two different physical distancing criteria. Number of unique contact partners is denoted by size and colour of nodes (large & red = central) with this standardised within each panel (max node size = 3x min node size). Each panel contains the same nodes, and same social connections between those observed together on more than one day,, but the number of unique edges occurring between individuals observed on just one day is reduced by the specified percentage. The panels show (A) the observed social network, (B, C and D) physical distancing scenario 1 at 20%, 40% and 60%, where edges that occurred on just one day are removed, and (E, F, G) physical distancing scenario 2 at 20%, 40% and 60% where edges

that occurred on just one day are reallocated to their other connections (see methods for details).

Each network is in the same network format across panels, which is a spring layout of the observed network then rescaled into an equally spaced filled circular format.

Supplementary video 1 (separate file) Examples of case isolation, contact tracing, testing and physical distancing scenarios on COVID-19 dynamics across the Haslemere network. See Figure 1 (main text) for a full description of the network