

## Supporting information

### Comparing previous estimates of viral clearance rate and viral degradation rate

Here we investigate the biological plausibility of the  $c_h \gg d_{ni}$  assumption, by comparing previous estimates of the viral clearance rate to estimates of the viral degradation rate, for various strains of influenza A:

- Estimates of  $c$  from within-host modelling of *in vivo* data range from  $1.4 d^{-1}$  ( $1/c = 17 h$ ) to  $28.4 d^{-1}$  ( $1/c = 50.7 min$ ) [1–5]. This range does not include estimates of  $c$  from *all* models within these references, as several of those models explicitly include some form of time-varying immune response in addition to the  $c$  parameter. As these studies did not estimate either  $c_h$  or  $d_{inf}$  directly, we treat each estimate of  $c$  as an upper bound on the corresponding estimate of  $c_h$ .
- Daum *et al.* [6] measured virus degradation via rRT-PCR assays — their results suggest a degradation rate of approximately  $0.06$ – $0.19 d^{-1}$ . We do not include their results for influenza stored in viral transport medium (VTM), as Daum *et al.* stated that those results suggested detection of vRNA via rRT-PCR was hindered for virus stored in VTM. Wang *et al.* [7] found that there was no significant change in rRT-PCR viral concentration when virus was stored for up to 3 days at room temperature in various storage media. Schulze-Horsel *et al.* [8] measured  $d_{ni}$  *in vitro* using HA assays (which measure viral concentration via the hemagglutinin surface protein rather than via internal vRNA), and found values of  $0 d^{-1}$ ,  $0 d^{-1}$ , and  $0.24 d^{-1}$  for three different strains of influenza. Möhler *et al.* [9] measured the degradation rate of influenza (via HA assays) to be  $0.072 d^{-1}$ .

These estimates support the biological plausibility of the  $c_h \gg d_{ni}$  assumption.

### Further details regarding data fitting

#### Fixed parameter and biologically realistic ranges for fitted parameters

We fix  $k = 3 d^{-1}$ , consistent with estimates obtained when fitting models (with normal or log-normal delay distributions for  $L$  and  $I$ ) to *in vitro* data [4, 10]. We investigated fitting for the latent period,  $k$ , but found that not only was  $k$  unidentifiable in both models, fitting rather than fixing  $k$  also significantly reduced model inference capability for several other parameters (data not shown).

For all fitted parameters, we specify a range of biologically plausible values (Table S1) which restrict the parameter space searchable by the genetic algorithm.

#### Estimating a lower bound for $V_{inf}^{TCID}(0)$

Theoretically, influenza infection could be initiated by as little as a single infectious virion in the URT. In order to set the lower bound for  $V_{inf}^{TCID}(0)$  to a value that corresponds to 1 infectious virion in the URT, we need to estimate:

1. the number of infectious virions that correspond to 1 TCID<sub>50</sub> (Handel *et al.* [2] estimated this to be somewhere in the range 1-100),

2. the conversion factor between *infectious virions/ml* in the URT and *infectious virions/ml* in nasal wash samples when they are assayed (Handel *et al.* [2] estimated that nasal wash sample concentrations were somewhere in the range of 1-100 times smaller than corresponding URT concentrations, while Beauchemin *et al.* [11] found that if a sample was frozen and then thawed before being assayed, there was about a 10-fold reduction in infectious viral load as measured via plaque assay),
3. the volume of the ferret URT (we estimate this to be approximately 1 *ml* based on URT volumes [12] of mammals with similar body weight to the ferrets in the Guarnaccia *et al.* experiments; i.e. 500–1500 *g*).

Based on these rough estimates, we assume a conservative lower bound of  $10^{-6}$   $TCID_{50}/ml$  for  $V_{inf}^{TCID}(0)$ .

## References

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## Tables

Table S1. Biologically realistic parameter ranges.

Parameter	Bounds	Source <sup>a</sup>
$V_{inf}^{TCID}(0)$	$[10^{-6}, 10^3]$	Upper bound informed by initial $V_{inf}^{TCID}$ measurements within the Guarnaccia <i>et al.</i> (under review) data; lower bound based on an estimate of the lowest possible TCID <sub>50</sub> value that corresponds to a single infectious virion in the URT (see “Estimating a lower bound for $V_{inf}^{TCID}(0)$ ”).
$\rho(0)$	$[10^{-1}, 10^{12}]$	Based on the variability of $\rho(t)$ within the Guarnaccia <i>et al.</i> (under review) data <sup>b</sup> .
$\beta$	$[10^{-9}, 10^{-1}]$	Previous <i>in vivo</i> and <i>in vitro</i> modelling estimates of $\beta$ [1–3, 5, 8, 9, 11, 15, 16].
$\delta$	$[0.24, 24]$	This range corresponds to average productively infected cell lifetimes (i.e. $1/\delta$ ) from 1 <i>h</i> to 100 <i>h</i> , consistent with previous <i>in vitro</i> observations [9, 17, 18] as well as both <i>in vivo</i> and <i>in vitro</i> model-fitting estimates [1–5, 8, 9, 11].
$p$	$[10^{-6}, 10^6]$	Previous <i>in vivo</i> and <i>in vitro</i> modelling estimates of $p$ [1–5, 8, 9, 11, 15, 16].
$c$	$[10^{-1}, 10^3]$	Previous <i>in vivo</i> estimates for $c$ obtained from target cell-limited models in which infection progress is limited by the availability of susceptible cells, rather than by immune response dynamics [1–5].
$c_h$	$[10^{-2}, 10^3]$	Previous <i>in vivo</i> estimates for $c$ obtained from target cell-limited models in which infection progress is limited by the availability of susceptible cells, rather than by immune response dynamics [1–5] <sup>c</sup> .
$d_{inf}$	$[2, 8]$	Previous <i>in vitro</i> estimates of $d_{inf}$ [8, 10, 11, 19–22].
$\xi$	$[10^{-2}, 10^7]$	Based on the variability of $\rho(t)$ within the Guarnaccia <i>et al.</i> (under review) data.

Lower and upper bounds for each fitted parameter.

<sup>a</sup>For reviews of parameter estimates obtained by within-host modelling influenza studies, see [13, 14].

<sup>b</sup>We use an upper bound that is several orders of magnitude higher than the highest measured  $\rho(t)$  value in the data, in order to allow for the possibility that many infectious virions could become non-infectious during transmission from one ferret to another.

<sup>c</sup>We use a smaller lower bound for  $c_h$  than that used for  $c$ , as we expect  $c_h$  to be somewhat lower than previous estimates of  $c$ , since those estimates implicitly include both  $c_h$  and  $d_{inf}$ .