

1 **Text S1. Assessment of model assumptions and limitations**

2 Our results support the hypothesis that inapparent infections contribute substantially to
3 DENV transmission. There are a number of uncertainties, however, that underscore the
4 need for future research on the human immune response to DENV infection and
5 correlates of disease severity. Below, we review the main limitations and data gaps
6 identified by our analysis.

- 7 • **Other predictors of infectiousness than plasma viral load.** Viremia is typically
8 estimated with the concentration of viral genome copies in plasma. Other factors have
9 been found to influence the probability of transmission to mosquitoes, such as
10 serological response and the day of illness [1]. Similarly, measures of infectious virus
11 across viremia profiles are needed to more fully understand how viremia dynamics
12 relate to a person's infectiousness to mosquitoes.
- 13 • **Limited immunological complexity of the within-host model.** In the absence of
14 data on target cell populations or effector immune responses, the ability to fit models
15 with greater complexity and, thereby, to enhance understanding of the human
16 immune response is limited [2,3]. Such studies could help reveal correlates of
17 differences in viremia between primary and secondary infections and gain
18 understanding on the mechanism(s) underlying enhanced infection efficiency in
19 people with asymptomatic and pre-symptomatic infections.
- 20 • **Infectiousness prior to onset of symptoms.** The within-host models that we used to
21 estimate viremia in people with symptomatic infections were fitted to post-
22 symptomatic viremia data only. Although realizations of pre-symptomatic viremia
23 were robust to the structural and parameter uncertainty that we explored [4], the

24 absence of pre-symptomatic data could lead to underestimation of early viremia
25 levels and, as a consequence, underestimation of pre-symptomatic infectiousness. In
26 addition, some parameters that drive early viremia trajectories were pre-assigned due
27 to identifiability restrictions, resulting in underestimation of variation in pre-
28 symptomatic viremia. Obtaining early viremia titer data, either through clustered
29 sampling around index cases (i.e., geographic or contact clusters) or possibly through
30 human challenge studies, depending on the virus strains used, would improve our
31 understanding of early DENV pathogenesis.

32 • **Viremia trajectories and infectiousness in inapparent symptomatic (IS)**
33 **infections.** The within-host model was fitted to data of apparent DENV infections
34 (AS). While severe or hospitalized dengue cases have been associated with higher
35 viremia levels than mild AS infections [1,5,6], it is unclear whether this extrapolates
36 to IS infections. Similarly, significant differences between infection efficiency were
37 found between severe and mild AS infections [1] as well as between As and S
38 infections [7], but where IS infections fall on this spectrum remains to be elucidated.
39 Antibodies are believed to play a role in viral clearance and may harbor information
40 on viral trajectories across clinical outcomes [3]. While no significant differences in
41 qualitative and quantitative antibody responses were found in children recovered from
42 a primary IS or AS infection, the breadth in both pre-existing and post-infection
43 antibodies differed significantly between secondary IS and AS infections [8]. Given
44 these uncertainties, we explored the two extreme scenarios: assuming IS infections to
45 be similar to either AS or As infections. The former was treated as the default
46 scenario to ensure consistency with the clinical subgroups used in Duong et al.[7].

47 The difference between the two scenarios in terms of estimated median contribution
48 of silent infections was 4%.

49 • **Viremia trajectories in asymptomatic (As) infections.** An empirically supported
50 reduction factor was applied [7] to distinguish between viremia in As and
51 symptomatic (S) infections. However, this factor may be confounded by the timing of
52 the plasma titer measurements [7]. As infections are difficult to identify and the
53 timing of infection is harder to infer than in symptomatic cases. Human challenge
54 studies could aid in clarifying the relationship between viremia progression in relation
55 to clinical outcome [9].

56 • **Post-secondary infections.** Little is known about the susceptibility to infection,
57 viremia trajectories, and infectiousness of post-secondary infections, in part because
58 determining a person's pre-exposure history after they have been infected with two
59 different DENV serotypes is not reliable [10]. Given the low proportion of AS
60 infections resulting from post-secondary infections (Fig S2), this may well be
61 accompanied with lower viral loads and lower net infectiousness [11,12]. As such, the
62 contribution of inapparent post-secondary infections may be lower than primary and
63 secondary infections. Under the assumption that post-secondary infectiousness is
64 equivalent to that of secondary infections (Fig S1), we estimated that the contribution
65 of As+IS infections could be up to 11% (95% CI 10-13%) higher when accounting
66 for these infections. This should be regarded as an upper bound, because the
67 proportion of As infections among post-secondary infections may well be higher than
68 among primary and secondary infections.

- 69 • **Uncertainty and individual heterogeneity.** The steep relationship between viral
70 load and transmission probability [7] in asymptomatic infections is subject to large
71 uncertainty. This results in a broad bimodal pattern in net infectiousness in which a
72 large proportion of asymptomatic infections displays very little infectiousness
73 whereas some are much more infectious than symptomatic individuals. It is not clear
74 how much of this results from parameter uncertainty and how much is a reflection of
75 individual heterogeneity. The fact that the steepness of this relationship is not
76 conserved to the same extent in the data from indirect feeding assays [7] is suggestive
77 of, but not conclusive about, a larger role of uncertainty than individual
78 heterogeneity. Larger sample sizes are required to resolve this issue.
- 79 • **Definitions and study designs differ across As:IS:AS rates.** The proportion of
80 apparent infections detected may vary according to the study design used [13], with
81 very active surveillance, as is typical in vaccine trials, resulting in somewhat higher
82 estimates of the proportion of apparent infections [14]. Individuals detected as
83 asymptomatic may become symptomatic later on, something not all study designs
84 account for. This can result in overestimates of As infections at the expense of S
85 infections. A universal, continuous metric for clinical dengue severity could aid in
86 revealing correlates of dengue disease severity that currently go unnoticed in
87 categorical analyses.
- 88 • **Additional factors influencing viremia, infectiousness, and clinical outcomes.**
89 While the estimated viral titers used in this analysis were fitted to only DENV-1,
90 these titers may well vary across serotypes [1,2,15], and may be affected by the time
91 since previous infection and the serotype a person was pre-exposed to. Similarly,

92 infectiousness is found to vary across virus serotypes [1], genotypes [16], and vector-
93 virus genotype interactions [17]. Rates of clinical disease and detection can vary
94 across regions due to factors such as DENV serotype [18], genotype [9,19], the
95 clinical outcome of a previous DENV infection [13,19] and time since a previous
96 outbreak [8], altering the relative contributions of infection classes.

97 • **Relation between symptoms and detection.** In our analysis, detection rates relied on
98 the assumption that the severity of symptoms is proportional to the proportion of
99 DENV infections detected by disease surveillance systems; i.e., IS are assumed not to
100 be detected. However, health-seeking behavior depends on many factors, not all of
101 which are related to the severity of symptoms. These include socio-economic factors,
102 access to health care, and the perception of the quality of available care, among others
103 [20]. In addition, there can be a delay between symptom onset and health seeking and
104 detection. Therefore, the contribution of individuals prior to detection is almost
105 certainly a conservative underestimate.

106 • **Extrinsic incubation period (EIP) may vary as a result of viral load [21-23].** The
107 relatively lower viremia of asymptomatic and secondary infections could increase the
108 length of the incubation period in the mosquito and consequently the net contributions
109 of those infection classes. At a given viremia level, however, people with
110 asymptomatic infections contributed to a higher mosquito viral load than those with
111 symptomatic infections [7]. The impact of lower asymptomatic viremia on the EIP,
112 therefore, may be smaller than expected based solely on viremia. Future
113 xenodiagnostic assessments of infectiousness to mosquitoes would be enhanced by
114 quantifying mosquito infection to test this hypothesis across infection classes.

115 • **Individuals that develop severe dengue may have a different infectiousness**
116 **profile.** Viremia estimates from Clapham et al. [4] are consistent with a higher peak
117 viral load and increased cell entry in individuals that develop severe dengue
118 compared to mild dengue cases. It is unclear how infectiousness differs for severe
119 cases, because temporal confounding due to differential health seeking behavior has
120 hampered direct comparison between severe and mild infections [1]. The impact of
121 including severe cases in the analysis is minor due to their small numerical
122 prominence, but their inclusion does increase the contribution of post-symptomatic
123 DAS infections from 1.0% (95% CI: 0.8-1.1%) to 2.1% (95% CI: 0.8-3.6). Severe
124 dengue cases will likely present with impaired mobility and hospitalization, which
125 could also affect their contact rates [24]. However, severe symptoms typically occur
126 after the infectious period has ended, so differences in contact rates between severe
127 and mild dengue cases could end up having a modest impact on their relative
128 contributions to transmission.

129

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