Message #1: the friendship paradox on average, your friends have more friends than you do  $\rightarrow$  a random individual has k friends with probability  $p_k$  $\rightarrow$  however, their friends have k friends with probability  $\propto kp_k$  by spreading on a contact network, the disease naturally oversamples individuals more likely to cause a larger number of

ignoring this effect leads back to the mass-action assumption

secondary infections

Message #2: the effect of superspreading events the PGF formalism falls back to the outcome of the SIR dynamics when  $p_k$  is a Poisson distribution  $R(\infty) = 1 - e^{-R_0 R(\infty)}$  $G_0(x) = G_1(x) = e^{R_0(x-1)}$ ; - the mass-action assumption is not appropriate for diseases

whose propagation is driven by superspreading events

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## Message #1: the friendship paradox

- on average, your friends have more friends than you do
  - $\rightarrow$  a random individual has k friends with probability  $p_k$
  - ightarrow however, their friends have k friends with probability  $\propto k p_k$
- by spreading on a contact network, the disease naturally oversamples individuals more likely to cause a larger number of secondary infections
- ignoring this effect leads back to the mass-action assumption

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Message #2: the effect of superspreading events

– the PGF formalism falls back to the outcome of the SIR dynamics when  $p_k$  is a Poisson distribution

$$G_0(x) = G_1(x) = e^{R_0(x-1)}; \qquad R(\infty) = 1 - e^{-R_0R(\infty)}$$

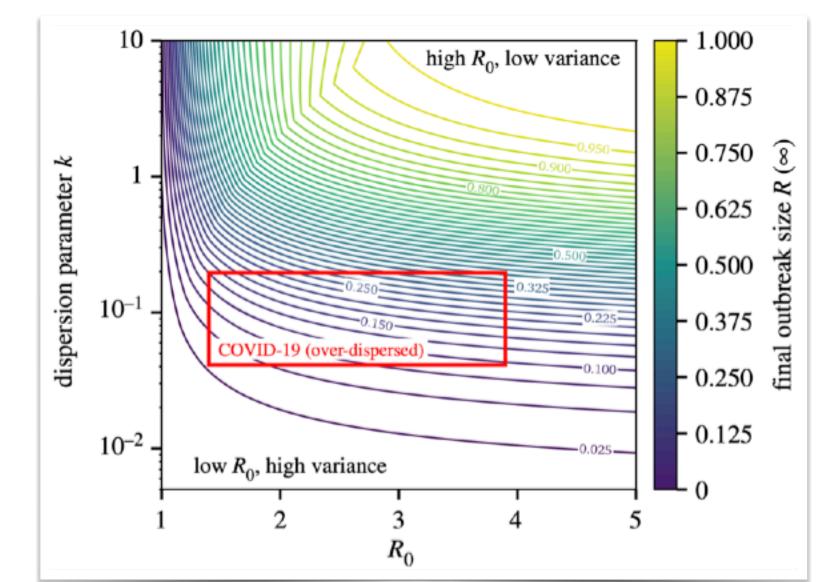
 the mass-action assumption is not appropriate for diseases whose propagation is driven by superspreading events Message #3 : we need to look beyond  $R_0$  for overdispersed infectious diseases like COVID-19

negative binomial distribution for secondary cases

$$G_1(x) = \left[1 + \frac{R_0(x-1)}{\gamma}\right]^{-\gamma}$$

shows the great impact overdispersion (small  $\gamma$ ) has on the spreading dynamics

– in other words, if  $R_0 > 1$ , our attention should not be focused on whether  $R_0$  equals 2.5 or 3.5, but rather be focused on figuring out how much heterogeneity there is behind it (what is  $\gamma$ ?)



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