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Superinfection reconciles host–parasite association and cross-species transmission



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HIGHLIGHTS

- Many parasites appear to exhibit host specificity.
- Many parasites are also efficient in cross-species transmissions.
- The above two phenomenon are largely incompatible without adaptive mutations.
- Superinfection facilitates apparent host specificity and cross-species transmission.

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ABSTRACT

Parasites are either dedicated to a narrow host range, or capable of exploiting a wide host range. Understanding how host ranges are determined is very important for public health, as well as wildlife, plant, livestock and agricultural diseases. Our current understanding of host–parasite associations hinges on co-evolution, which assumes evolved host preferences (host specialization) of the parasite. Despite the explanatory power of this framework, we have only a vague understanding of why many parasites routinely cross the host species' barrier. Here we introduce a simple model demonstrating how superinfection (in a heterogeneous community) can promote host–parasite association. Strikingly, the model illustrates that strong host–parasite association occurs in the absence of host specialization, while still permitting cross-species transmission. For decades, host specialization has been foundational in explaining the maintenance of distinct parasites/strains in host species. We argue that host specializations may be exaggerated, and can occur as a byproduct (not necessarily the cause) of host–parasite associations.

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1. Introduction

Many parasites in nature are associated with a host species, or a group of related species. Examples of host–parasite association can be found in a range of disease systems including HIV/SIV, rabies, malaria, and Lyme borreliosis (Garamszegi, 2006; Hahn et al., 2000; Kurtenbach et al., 2002; Streicker et al., 2010). In certain cases there are natural barriers to the exploitation of multiple host species, e.g. sexually transmitted diseases. Yet other disease systems relying on direct, vectored, or environmental transmission allow for a potentially wide host range. In these systems, the factors that determine whether parasites focus on a narrow range of species or adopt a more generalist strategy are typically not known, yet the mechanisms at play have important consequences for public health and beyond. For instance, zoonotic parasites

cause significant human disease burden worldwide (Jones et al., 2008), and any practical disease intervention strategy requires some knowledge of the associated host species. Further, these parasites may transmit through multiple wildlife species. Such complex transmission cycles are robust in the sense that blocking transmission from one host species may only partially control human disease risk—as demonstrated in North American Lyme disease (Tsao et al., 2004). Recently, an urgent hunt for the reservoir host(s) of Ebola virus, Henipavirus, and SARS-coronavirus has implicated bats (Dobson, 2005). Given our limited understanding of the transmission competency of alternative hosts, and of bat-virus dynamics in general, it is unclear if targeting any number of bat species would be effective in reducing human disease risk.

Arguably, one of the worst-case scenarios for public health is a host shifting event, defined as a parasite/strain that was previously zoonotic and now circulates exclusively among humans; HIV/AIDS is a prime example (Hahn et al., 2000). Additional examples are drawn from studies on primate malarias, which have identified multiple host shifts from non-human primates to humans (Krief et al., 2010; Mu et al., 2005), which include the malaria parasites *Plasmodium falciparum* and *P. vivax*. All of these examples illustrate

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that understanding parasite host ranges is crucial for global disease management.

The prevailing data on host–parasite systems suggest there are at least two influential factors in determining a parasite's host range (Woolhouse et al., 2001): (1) the community-level contact structure, which determines opportunities for cross-species transmission; and (2) the standing genetic diversity of the parasite. Essentially, the combination of host species availability and the potential for adaptive evolution is thought to be the dominant force in shaping a parasite's host range. A realized host range that is less than all contactable hosts (few infections in some species, despite them being accessible to the parasite) reflects a degree of host association by the parasite or strain. A central concept is that host–parasite association results from host specialization; the adaptive evolution of the parasite, leading to a specific host preference (Levene, 1953). The difficulty with host specialization is that it does not easily explain how many parasites routinely cross the species' barrier, unless we invoke recurrent adaptation by the parasite. For example, a parasite that evolves a preference towards one host species is unlikely to cause an outbreak in an alternate species, unless a mutation occurs that either enhances cross-species transmission, or improves within-species transmission in the alternative host population. While this condition is plausible for rapidly-mutating viruses, it is cumbersome for relatively slow-evolving bacteria and protist parasites, and, we argue, not the only mechanism that can explain variable patterns of host–parasite association in nature.

In this study we use mathematical modeling to examine whether general parasite transmission processes can lead to variability in host association patterns (along a spectrum of restricted to unrestricted host ranges) while still allowing for frequent cases of cross-species transmission. Notably, we explore this in the absence of recurrent adaptation to isolate the potential effects of ecology and transmission. Specifically, we focus on the role of superinfection in driving host associations and cross-species transmissions—two common, empirical phenomena that appear to be at odds with each other. Although earlier studies have investigated parasite transmission in heterogeneous populations (Gandon, 2004; Woolhouse et al., 2001), the effects of superinfection in such populations are rarely invoked.

2. System of equations

$$\begin{aligned} \frac{dS_1}{dt} &= b_0(S_1 + I_{1A} + I_{1B}) - b_1[(S_1 + I_{1A} + I_{1B})^2] \\ &\quad - \mu S_1 - [\beta S_1(I_{1A} + I_{1B}) + \beta r S_1(I_{2A} + I_{2B})] \\ \frac{dS_2}{dt} &= b_0(S_2 + I_{2A} + I_{2B}) - b_1[(S_2 + I_{2A} + I_{2B})^2] \\ &\quad - \mu S_2 - [\beta S_2(I_{2A} + I_{2B}) + \beta r S_2(I_{1A} + I_{1B})] \\ \frac{dI_{1A}}{dt} &= \beta S_1 I_{1A} + q\beta I_{1B} I_{1A} + q\beta r I_{1B} I_{2A} + \beta r S_1 I_{2A} - (\mu + v) I_{1A} \\ \frac{dI_{1B}}{dt} &= \beta S_1 I_{1B} + \beta r S_1 I_{2B} - [q\beta I_{1B} I_{1A} + q\beta r I_{1B} I_{2A} + (\mu + f v) I_{1B}] \\ \frac{dI_{2A}}{dt} &= \beta S_2 I_{2A} + \beta r S_2 I_{1A} + \varepsilon q\beta I_{2B} I_{2A} + \varepsilon q\beta r I_{2B} I_{1A} - (\mu + v) I_{2A} \\ \frac{dI_{2B}}{dt} &= \beta S_2 I_{2B} + \beta r S_2 I_{1B} \\ &\quad - [\varepsilon q\beta I_{2B} I_{2A} + \varepsilon q\beta r I_{2B} I_{1A} + (\mu + f v) I_{2B}]. \end{aligned}$$

2.1. The deterministic model

The model depicted in Fig. 1 and the system of equations in Section 2 represents a host–parasite system of two host species

(S), denoted by subscripts 1 and 2, and two parasites: A and B. Infected hosts are classified as either I_{1A} , I_{1B} , I_{2A} , I_{2B} . Host populations recover from losses (natural mortality and disease-induced mortality, also called virulence) via a density-dependent birth rate, $bN = (b_0 - b_1 N)N$, where b_0 is the density-independent birth rate and b_1 is a density-dependent factor. Both strains have a higher transmission rate between hosts of the same species compared to cross-species transmission, reflecting a degree of ecological separation between host types, controlled by parameter r . Parasite B transmits within each host species at rate βSI , where β is the transmission rate. Parasite A transmits at rate βSI in both host species, and additionally is capable of superinfection (infecting an individual currently infected by parasite B). The superinfection rates are $q\beta SI$ for I_1 and $\varepsilon q\beta SI$ for I_2 . This assumption articulates that we regard A as an aggressive mutant, which superinfects I_{1B} preferentially (that is, parameter $\varepsilon < 1$ ensures the superinfection rate of type 2 hosts is lower than that of type 1 hosts). The reasoning for this assumption is that the ability to superinfect a host is jointly dependent on the aggression of the superinfecting strain (to outcompete the inhost resident strain) and host-specific immunity (to permit secondary infection), i.e. a combination of host and parasite effects. It is therefore conservative to assume that distinct host species differ in their degree to permit superinfection ($[I_{1B} \rightarrow I_{1A}] \neq [I_{2B} \rightarrow I_{2A}]$). Potential specific mechanisms include differences in the cost or quality of immune activation, which may be initiated (or exacerbated) from immune priming by an unrelated parasite (Telfer et al., 2010), or by species-specific energy expenditures, such as migration (Altizer et al., 2011; Weber and Stilianakis, 2007). The parameter ε allows a range of superinfection disparity to be explored. The outcome of superinfection is immediate takeover of the I_B individual by strain A, yielding an I_A individual. Rates of primary infections of both hosts by both strains are equal; there is no intrinsic host preference. As a consequence of its aggression, strain A carries a greater virulence cost (reflected by v) in I_1 and I_2 subpopulations than strain B (where virulence is modeled by $-fvI$ with $f < 1$). We examine a range of differences in virulence costs between strains. We set equal population sizes and growth dynamics of S_1 and S_2 in order to distinguish the effects of superinfection in isolation, otherwise a larger (or more fecund) host group may confound the advantage or cost of superinfection; we show in Supplementary materials that relaxing these assumptions does not change the general outcome of our model. Initial conditions and parameters are listed in Table 1. All deterministic simulations began with strain B at equilibrium followed by an introduction of strain A and an evolutionary period of 500 years. We arbitrarily define a host-associated parasite as having 80% of its infections in one host species.

2.2. The stochastic model

We extended our analysis with stochastic simulations of the superinfection model and compared these with results from a stochastic host-specialization model, both implemented by the adaptive tau-leap method (Cao et al., 2007) in a Gillespie framework (Gillespie, 1977). Our chief aim was to examine whether appreciable cross-species transmission occurred in the absence of adaptive evolution. Modeling host specializations typically includes some form of explicit tradeoff in parasite transmission (Anderson and May, 1979; Gudelj et al., 2004; Regoes et al., 2000). The essential idea is that a parasite that increases its transmission to one host species does so at the cost of transmission to alternative host types. The cost to the specialist parasite is that by increasing its exploitation of one host, it consequently reduces its exploitation and transmission in alternative hosts (Frank, 1996; Regoes et al., 2000). We model this phenomenon by having two β values, β_L and β_H , which represent a low and high transmission rate, respectively. We then compare this asymmetrical transmission model with the

Table 1
Model parameters and initial conditions.

Name	Description	Value
S_1	Susceptible hosts of species 1	20
S_2	Susceptible hosts of species 2	20
I_{1A}	Infected species 1 with type A	5
I_{1B}	Infected species 1 with type B ^a	75
I_{2A}	Infected species 2 with type A	5
I_{2B}	Infected species 2 with type B ^a	75
b_0	Density-independent birth rate ^b	0.02
b_1	Slope of per-capita birth rate with population size ^b	0.00014
$\beta/\beta_H/\beta_L$	Transmission rate	0.0005/0.0008/0.0002
μ	Mortality rate ^c	0.006
r	Scaling factor for between species transmission relative to within species transmission	0.01
q	Scaling factor for superinfection in species 1	0.05–0.5
v	Virulence	0–0.005
ε	Scaling factor for superinfection in species 2 (used as a multiplier of q)	0–0.5
f	Scaling factor for virulence of strain B (used as a multiplier of v)	0–0.5

^a Equilibrated values of resident parasite.

^b Per capita birth rate is density-dependent: $b = b_0 - b_1N$, with a carrying capacity of 100 individuals.

^c Mortality is constant and broadly consistent with a variety of rodent and avian hosts.

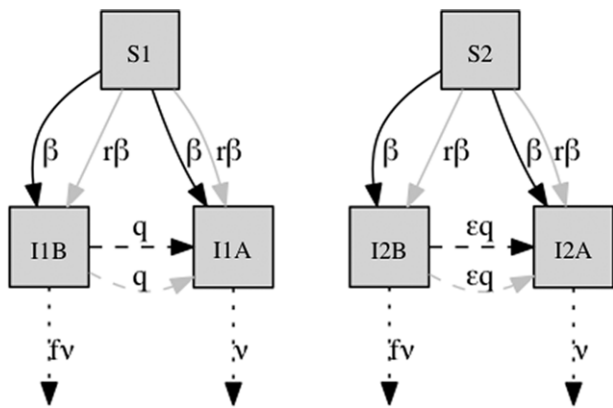


Fig. 1. Host association model diagram.

Note: Model schematic: S_1 and S_2 represent susceptible hosts from distinct species. I_{1A} and I_{1B} are infected hosts of type 1 infected by A or B. I_{2A} and I_{2B} are infected hosts of type 2 infected by A or B. Transitions in the system of equations Section 2: Regular infection (solid arrows) can occur via direct transmission (DT, within host species, black arrows) and via cross-species transmission (CST, gray arrows, at a rate reduced by factor $0 < r < 1$). Superinfection (dashed arrows) can occur directly (DSI, within host species, black arrows) and between host species (CSI, gray arrows). Host species 2 experiences superinfection at a rate reduced by factor $0 < \varepsilon < 1$. Both parasites A and B cause disease-induced mortality, though the rate associated with parasite B is reduced by a factor $0 < f < 1$.

superinfection/virulence model in a stochastic framework. Aside from the absence of a single transmission parameter (β) and the inclusion of two transmission parameters (β_L, β_H), the asymmetric transmission model shares an identical structure with the other models.

3. Results and discussion

Our modeling approach builds on previous work (Gudelj et al., 2004; Nowak and May, 1994; Regoes et al., 2000) with several novel extensions: (1) we incorporate superinfection in a heterogeneous host environment, rather than a single host population; (2) we assume a parasite strain superinfects distinct host species differentially, rather than equally—since primary infections are interactions between a parasite and host that can either mitigate or facilitate superinfection (Sadd and Schmid-Hempel, 2009; Telfer et al., 2010; Ulrich and Schmid-Hempel, 2012); and (3) strains do not have a transmission advantage in either host species. At low levels of virulence, the superinfection advantage of A outweighs its virulence cost, leading to the complete dominance of A in both host species (Fig. 2A—Type I). At moderate virulence, we observe strong

host association of the two strains, yielding I_{1A} and I_{2B} subpopulations. This phenomenon is indicated by the ‘windows’ outlined in dashed boxes in Fig. 2—Type III, which is defined by an 80/20 rule where at least 80% of all hosts infected by a strain belong to one species. Note that a low relative prevalence of A in host species 2 represents a high prevalence of B in host species 2. At higher virulence, the cost of A outweighs its superinfection advantage, which leads to the dominance of B in both host species (Fig. 2A—Type V). Lastly, at intermediate ranges of virulence we find an overlap in the host ranges of either strain (Fig. 2A—Types II and IV), which results from less dramatic changes in the cost–benefit balance of virulence and superinfection. Details on equilibria can be found in supplemental Figs. S1–S4. In contrast, if a mutant strain were to arise that had only one of the characteristics assumed here (superinfection or virulence) then it would either drive the resident strain extinct (superinfection alone) or go extinct itself (virulence alone) as demonstrated in supplemental Fig. S5. The variable patterns of parasite coexistence (Fig. 2, regimes I–V) requires both superinfection and virulence in the mutant strain A.

The four panels of Fig. 2 represent strict and relaxed parameterizations of the model. Fig. 2A represents the strict case where the difference between the mutant strain A in host species 1 and 2 is most extreme (no superinfection in S_2 ; $\varepsilon = 0$), and no virulence cost for I_B ($f = 0$). We relax the assumptions of superinfection and virulence by allowing A to additionally superinfect B individuals in I_{2B} at a reduced rate (Fig. 2—panels B, D), and by setting a virulence cost for B in both host species (see Fig. 2—panels C, D). The corresponding windows are altered as follows: (1) allowing superinfection in both hosts reduces the parameter space for host association; and (2) including a virulence cost for both parasites increases this parameter space.

Superinfection can explain host–parasite association in a unique manner: intrinsic generalists become host-associated due to outcomes of within-host competition. Conventional thinking dictates that adaptation creates a specialist parasite, and subsequent adaptation enables that parasite to cross the species’ barrier. Superinfection relaxes these conditions of adaptation, and can promote cross-species transmission while maintaining host–parasite associations (Fig. 3 and Table 2). Fig. 3 illustrates a comparison of superinfection versus host specialization and how each scenario influences cross-species transmission; indicated by relative prevalence approaching 0.5 in both host species. Both mechanisms can produce similar, mean levels of host association. However, in the superinfection model, stochastic transmission can allow relative prevalences to transiently deviate from our 80/20 definition of host–parasite association, typifying outbreak dynamics without recurrent adaptive mutations. This is not the case un-

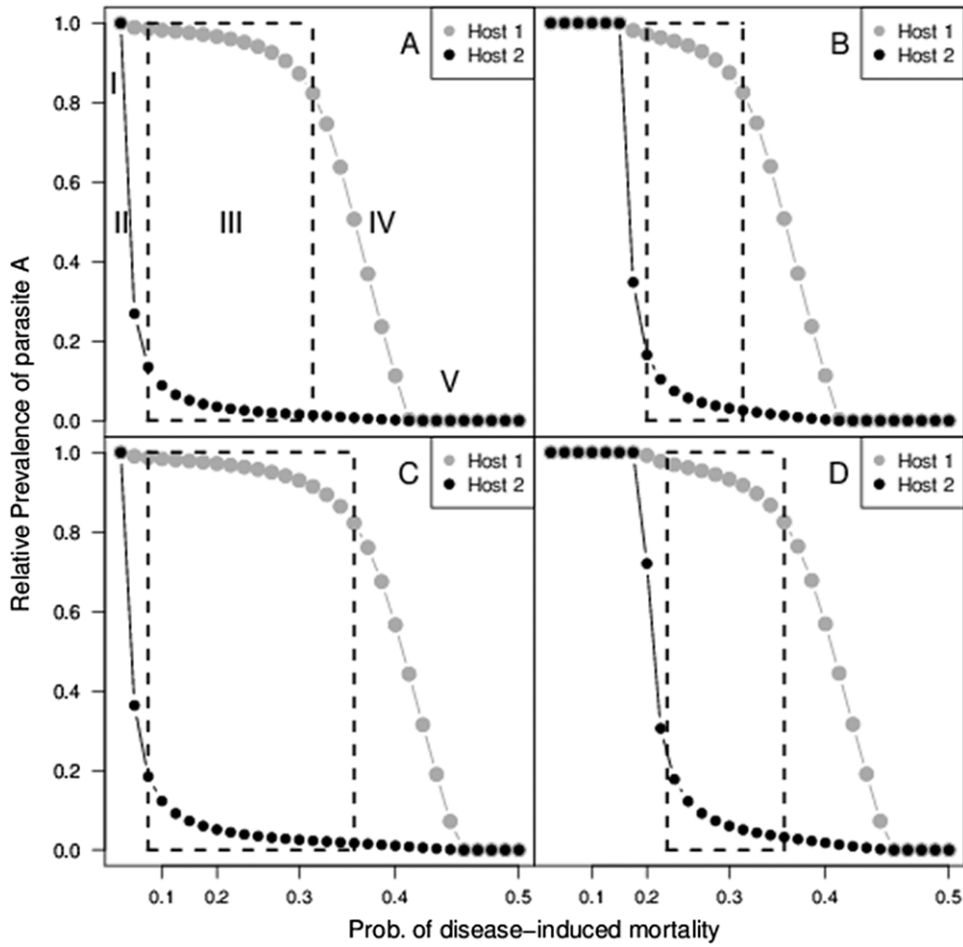


Fig. 2. Host association patterns under varied assumptions.

Note: The four panels show the (equilibrium) relative prevalence of parasite $A[I_A/(I_A+I_B)]$ in both host species on the y-axis and the probability of disease-induced mortality on the x-axis. Dashed boxes represent parameter space leading to reciprocal host association. Roman numerals (panel A) indicate types of host association patterns described in the main text. Panel A illustrates no superinfection of I_2B ($\epsilon = 0$) and no virulence cost for parasite B ($f = 0$). Panel B depicts $\epsilon = 0.25$ and $f = 0$. Panel C depicts $\epsilon = 0$ and $f = 0.25$. And panel D depicts $\epsilon = 0.25$ and $f = 0.25$. The basic superinfection rate q is set to 0.1 for all panels. Note the relative prevalences indicate that high A reflects low B , and low A reflects high B . The x-axes show the probability of disease-induced mortality, defined as $v/(v + \mu)$.

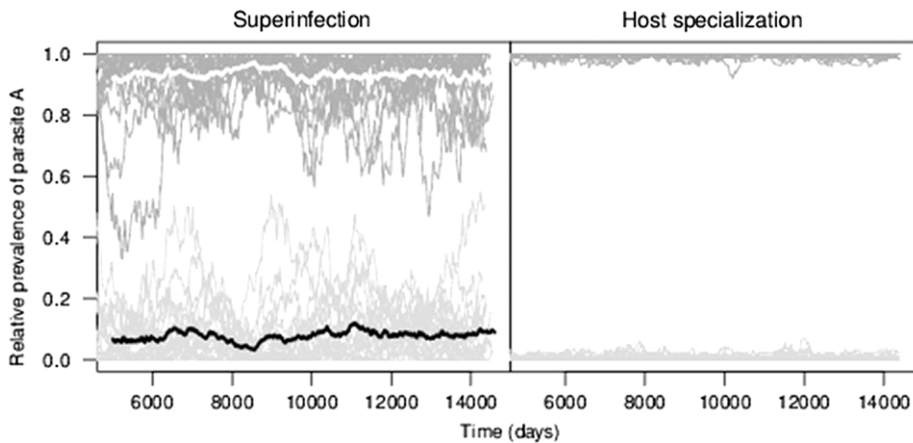


Fig. 3. Superinfection versus host specialization.

Note: Shown above are results from stochastic formulations of the host association model (Fig. 1). The two panels show 25 stochastic projections of the relative prevalence of parasite $A[I_A/(I_A+I_B)]$ in host 1 (dark gray) and host 2 (light gray) on the y-axis against time on the x-axis. The superinfection model is parameterized as shown in Fig. 2D; transmission is unbiased at $\beta = 0.0005$ and virulence is $v = 0.0025$. White and black lines represent mean prevalences calculated from the stochastic projections. The host specialization model has no superinfection ($q = 0$), no virulence ($v = 0$), and a transmission bias ($\beta_H = 0.0008$ or $\beta_L = 0.0002$) for the associated hosts (I_{1A} and I_{2B}). Trajectories that approach the interior of a plot indicate an increase of a parasite (A or B) in a host population from previously low levels; note that a decrease in the relative prevalence of A indicates an increase in the relative prevalence of B . Simulation time represents 40 years.

Table 2

Parasite extinction rates under varied levels of virulence (stochastic superinfection model illustrated in Fig. 3).

Type	Virulence	$A_{\text{extinction}}$	A_{lower}	A_{upper}	$B_{\text{extinction}}$	B_{lower}	B_{upper}
I	0.0005	0.05	0.016	0.112	0.91	0.836	0.958
II	0.002	0.17	0.102	0.258	0.02	0.002	0.07
III	0.0025	0.29	0.203	0.389	0	0	0.036
IV	0.004	0.81	0.719	0.881	0	0	0.036
V	0.0045	0.97	0.914	0.993	0	0	0.03

Note: Extinction = the number of simulations in which parasite *A* or *B* went extinct.Lower = lower bound binomial confidence limit ($p < 0.05$).Upper = upper bound binomial confidence limit ($p < 0.05$).

100 simulations were performed for each virulence level.

der host specialization, which depicts strains *A* and *B* transmitting through preferred hosts with biased transmission efficiencies. In order for host specialization to present stochastic dynamics similar to superinfection, recurrent adaptation is required. Discerning the mechanism responsible for observed host–parasite association patterns from data is not trivial, especially since many time series are data-sparse and cover a short time interval. This finding raises questions on whether surveyed host associations (Brisson and Dykhuizen, 2004; Fallon et al., 2005; Garamszegi, 2006; Sasal et al., 1998; Streicker et al., 2010) are actually examples of host specialization. Host–parasite associations have been observed in distinct host orders (Blanquart and Gascuel, 2011; Fallon et al., 2005; Hanincová et al., 2006); equally, diverse parasite groups have been observed to form structured hosts associations, including macroparasites (Abollo et al., 1998), ectoparasites (Wells et al., 2013), viruses (Streicker et al., 2010), and bacteria (Brisson and Dykhuizen, 2004). Moreover, when host specialization does occur, it can be a consequence of host–parasite association, rather than a cause. For example, relaxed selection (Lahti et al., 2009; Remold et al., 2008) can account for specialization through erosion of (underutilized) genetic determinants that facilitate transmission to alternative hosts. Another possibility is the fixation of specializing alleles by genetic drift, and not by natural selection. Consequently, the role of host specialization in driving host–parasite associations in nature is potentially exaggerated. A basic test for genuine host specialization is a two-host, two-parasite infection study that demonstrates a host preference either through greater transmissibility or a longer duration of infection. If surveyed host–association data supports host specialization while experimental infections do not, then we can be certain that an alternative mechanism is at play. Superinfection may be operating if there is evidence of a competitive advantage within a host type, and if the competitive parasite carries a high virulence cost relative to a sub-competitive parasite. The most immediate concern raised by our work relates to the study and prevention of zoonoses. Essentially, detecting a majority of parasite infections in a narrow group of wildlife species suggests, but does not confirm, host specialization. Therefore, targeting putative reservoir species through culling or vaccination may have unpredictable, or even undesirable, effects on disease dynamics (Bolzoni and De Leo, 2013; Choisy and Rohani, 2006).

4. Conclusion

We conclude that host–parasite association and pervasive cross-species transmission can co-occur without recurrent adaptation, provided there are biases in superinfection between host species. Our study introduces a novel mechanism to the growing modeling literature in community epidemiology (Fenton and Pedersen, 2005; Roche et al., 2013), and provides new insight into the nature of host–parasite assemblages.

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Appendix A. Supplementary material

Supplementary material related to this article can be found online at <http://dx.doi.org/10.1016/j.tpb.2013.09.015>.

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