

# Quantifying the effects of parasites on the maintenance of sex

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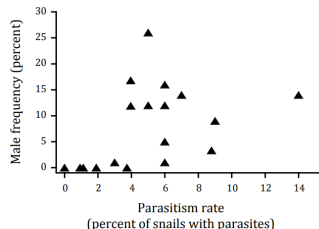
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# Evolution of sex

- **Two-fold cost of sex:** (1) cost of producing males and (2) cost of meiosis
- the two-fold cost of cost of sex assumes that **all else is equal**
- only 0.01% eukaryotes conform to purely asexual reproduction. How?

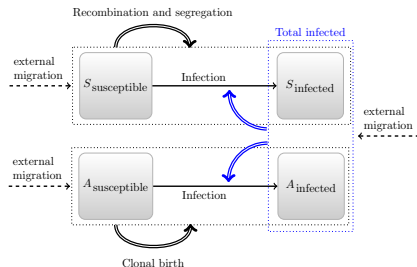
# Red Queen Hypothesis

- sexual reproduction creates rare genotypes that can escape infection (**negative frequency dependence**)
- snail population in New Zealand (host for sterilizing trematode infection) is believed to support the hypothesis [1]
- prevalence of sex should be **positively correlated** with prevalence of infection [2]
- unable to detect any correlation in a similar snail-trematode system. Why? [3]



**Figure:** Prevalence of infection is positively correlated with male frequency [4].

# Mathematical model



**Figure:** Graphical representation of the model. Double lined arrows represent dynamics that are affected by mixing between habitats.

- competition of obligate sexual v.s. obligate asexual hosts under parasite selection. Hosts are assumed to be diploids and parasites are assumed to be haploids [5]

- offsprings produced by hosts from a site:

$$\begin{cases} S'_{ij} = c_b(1 - s) (W_U S_{ij,U}(t) + W_I S_{ij,I}(t)) \\ A'_{ij} = W_U A_{ij,U}(t) + W_I A_{ij,I}(t) \end{cases}$$

$S'_{ij}$  then goes through recombination and segregation after. Virulence is defined as  $V = 1 - W_I/W_U$ .

- expected offsprings in site  $k$  in next generation accounting for mixing between sites:

$$E \left( X_{ij}^k(t+1) \right) = (1 - \epsilon_{\text{site}}) X_{ij}^k + \frac{\epsilon_{\text{site}}}{n_{\text{site}} - 1} \sum_{l \neq k} X_{ij}^l,$$

where  $X$  can be replaced with either  $A$  or  $S$ .

- number of offsprings is taken as a poisson random variable

$s$ : frequency of males,  $W_U$  and  $W_I$ : fitness of uninfected and infected hosts,  $c_b$  scaling factor for cost of sex,  $\epsilon_{\text{site}}$ : mixing between sites

- poisson mean number of exposures caused by parasites  $i$ :

$$\lambda_i^k = \frac{\beta^k}{2N^k(t+1)} I_i',$$

where  $I_i'$  is the number of hosts infected by parasite  $i$  after accounting for recombination.

- accounting for mixing between sites:

$$\lambda_{i,\text{total}}^k = (1 - \epsilon_{\text{site}}) \lambda_i^k + \frac{\epsilon_{\text{site}}}{n_{\text{site}} - 1} \sum_{l \neq k} \lambda_i^l$$

- force of infection:  $\text{FOI}_{ij}^k = \lambda_{i,\text{total}}^k + \lambda_{j,\text{total}}^k$ .
- infection is modeled using a binomial random variable with  $P_{ij}^k(t+1) = 1 - \exp(-\text{FOI}_{ij}^k)$ .

$\beta^k$ : the transmission rate at each site.

# Simulation

- transmission rate is randomly drawn from a lognormal distribution with parameters  $\beta_{\text{meanlog}}, \beta_{\text{sdlog}}$
- number of asexual genotypes present in the system is fixed to  $G_{\text{asex}}$
- sexual hosts are allowed to mix under parasite selection without asexual hosts for 500 generations; then, asexual hosts are introduced and the simulation runs for 600 generations

# Approximate Bayesian Computation

- fitted to two spatial data [3, 4] and one spatio temporal data [1]
- prior distribution on  $\beta_{\text{meanlog}}, \beta_{\text{sdlog}}, c_b, \epsilon_{\text{site}}, V, G_{\text{asex}}$ . Rest are fixed.
- almost uninformative priors for all except  $c_b$ ; it was scaled to approximately match the 95% CI for cost of sex reported by [6]
- considered absolute difference in summary statistics: mean prevalence of sex and infection and CV in mean prevalence of sex and infection across generations/sites

Parameters	Dagan <i>et al.</i> [3]	McKone <i>et al.</i> [4]	Vergara <i>et al.</i> [1]
$\beta_{\text{meanlog}}$	Cauchy(location = 0, scale = 2)		Cauchy(location = 2, scale = 1)
$\beta_{\text{sdlog}}$	Lognormal(meanlog = 0, sdlog = 2)		
$c_b$	Lognormal(meanlog = -0.1, sdlog = 0.1)		
$\epsilon_{\text{site}}$	Beta(shape1 = 1, shape2 = 9)	Beta(shape1 = 2, shape2 = 8)	Beta(shape1 = 1, shape2 = 9)
$V$	Beta(shape1 = 6, shape2 = 2)		
$G_{\text{asex}}$	BetaBinom(size = 9, prob = 5/9, theta = 5) + 1		BetaBinom(size = 9, prob = 3/9, theta = 5) + 1



# Sequential Monte Carlo

- way to approximate the posterior more efficiently
- perform ABC with high tolerance; perform ABC again but draw a weighted sample from the accepted values instead and "jump"
- modified Population Monte Carlo suggested by [7]. Parameters were transformed to an unconstrained scale (possible for all except  $G_{\text{asex}}$ ) and jump through gaussian kernel independently for each parameter:

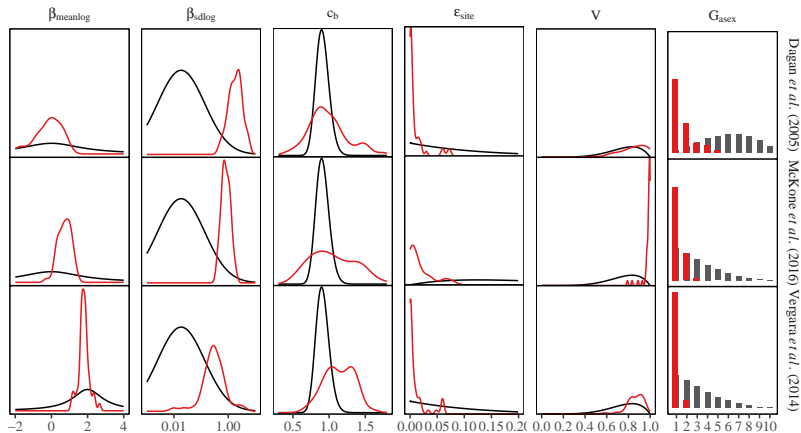
$$q(\cdot | \theta_i^*) \sim \text{Normal}(\mu = \theta_i^*, \sigma^2 = 2\text{Var}(\theta_{i,t-1})),$$

where  $\theta_i^*$  is the  $i$ -th parameter of a transformed accepted parameter sample,  $\theta^*$ , from the last run (a sample we're jumping from) and  $\theta_{t-1}$  is the marginal set of accepted  $i$ -th parameters from the last run,

- binomial jump for  $G_{\text{asex}}$  but prevent it from fixing:

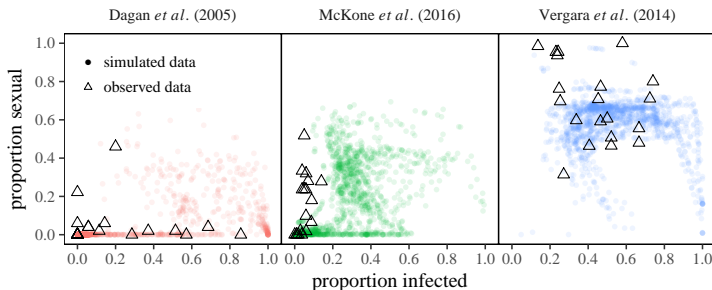
$$q(\cdot | G_{\text{asex}}^*) \sim \text{Binomial}(\text{size} = 9, p = (G_{\text{asex}}^* - 0.5)/10) + 1$$

# Result - ABC



**Figure:** (black) prior distributions where parameters sampled from and (red) posterior distributions obtained from ABC

# Result - simulated data v.s. observed data



**Figure:** Simulated data v.s. observed data. Each point for simulated data represents mean proportion infected and sexual at each site.

- overestimates proportion infected when fitted to McKone *et al.* [4]
- spatial structure allows high level of infection to be maintained even at high virulence (middle panel)
- initially increasing prevalence of sexual reproduction pulls back infection (consistent with [2]) and causes prevalence of infection to decrease; quadratic overall?

# Result - Power analysis

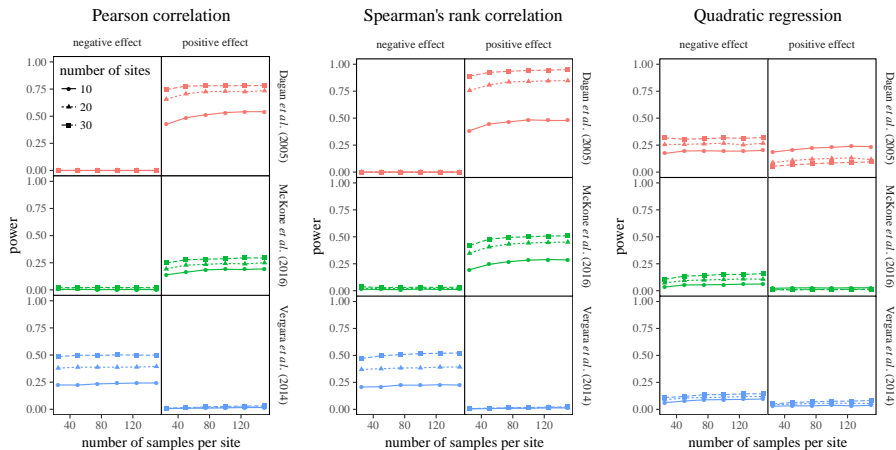
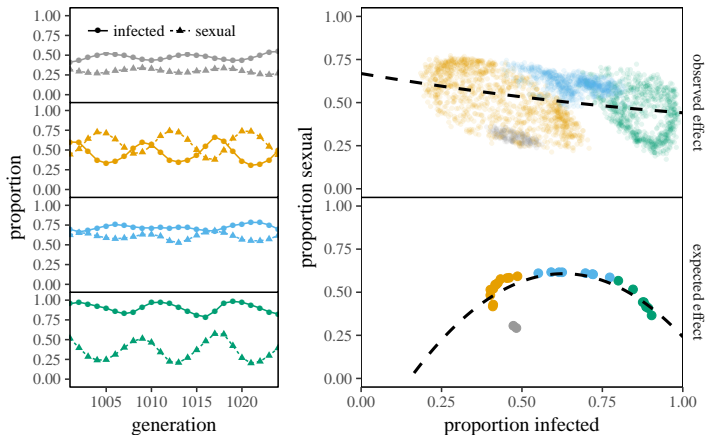


Figure: Power analysis for detecting a correlation and negative quadratic curvature.

# Discussion - Why low power?



**Figure:** A sample data from a posterior sample. (left) type of cycles present in a simulated data (right) observed relationship v.s. expected relationship. (dashed line) quadratic regression.

# Discussion - Why low power?

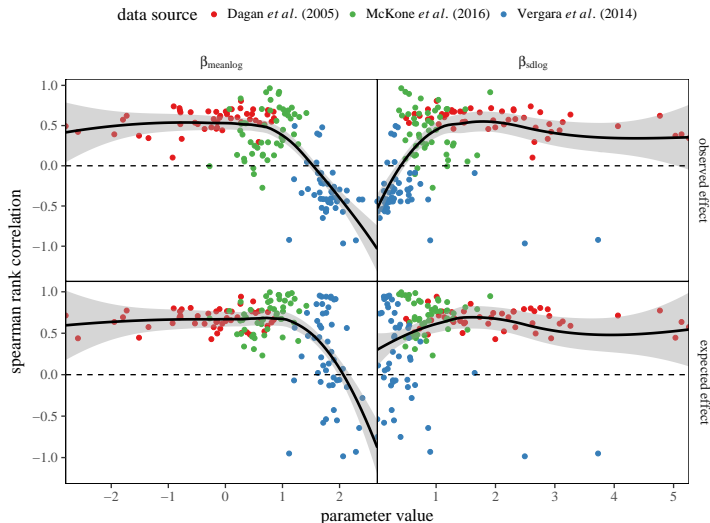


Figure: sensisivity plot of observed relationship v.s. expected relationship.

- Red Queen hypothesis not appropriate for Dagan *et al.* data? (high asexual diversity, highly interconnected but diverse habitats, strong drift by seasonal flood [8])
- spatial data provides limited information; only Vergara *et al.* [1] had spatiotemporal data
- identify different cycles in nature?
- is there a way to detect the Red Queen cycles from a spatiotemporal data? or account for cycles in a spatial data?
- consider pluralistic approach (Red Queen hypothesis + other mechanisms for maintaining sex)?

# Reference

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