Impact of ploidy and pathogen life cycle on resistance durability

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1 Abstract

The breeding of resistant hosts based on the gene-for-gene interaction is crucial to address epidemics of plant pathogens in agroecosystems. Resistant host deployment strategies are developed and studied worldwide to decrease the probability of resistance breakdown and increase the resistance durability in various pathosystems. A major component of deployment host strategies is the proportion of resistant hosts in the landscape. However, the impact of this proportion on resistance durability remains unclear for diploid pathogens with complex life cycles. In this study, we modelled pathogen population dynamics and genetic evolution at the virulence locus to assess the impact of the ploidy (haploid or diploid) and the pathogen's life cycle (with or without host alternation) on resistance durability. Ploidy has a strong impact on evolutionary trajectories, with much greater stochasticity and delayed times of resistance breakdown for diploids. This result emphasizes the importance of genetic drift in this system: as the virulent allele is recessive, positive selection on resistant hosts only applies to homozygous (virulent) individuals, which may lead to population collapses at low frequencies of the virulent allele. We also observed differences in the effect of host deployment depending on the pathogen's life cycle. With host alternation, the probability that the pathogen population collapses strongly increases with the proportion of resistant hosts in the landscape. Therefore, resistance breakdown events occurring at high proportions of resistant hosts frequently amount to evolutionary rescue. Last, life cycles correspond to two selection regimes: without host alternation (soft selection) the resistance breakdown is mainly driven by the migration rate. Conversely, host alternation (hard selection) resembles an all-or-nothing game, with stochastic trajectories caused by the recurrent allele redistributions on the alternate host.

2 Introduction

Plant pathogens can quickly evolve (Perkins et al. 2013), and the loss of host genetic diversity in agroecosystems compared to natural ecosystems can enhance the spread of epidemics (Mundt 2002; Burdon et al. 2008; Garrett et al. 2009; Haas et al. 2011; Ostfeld et al. 2012). In this context, many plant protection strategies are developed and studied worldwide (Bousset et al. 2013), particularly spatio-temporal host resistance deployment strategies (Mundt 2002; Gilligan et al. 2008; Sapoukhina et al. 2009; Burdon et al. 2014; Djian-Caporalino et al. 2014; Fabre et al. 2015; Bousset et al. 2018; Rimbaud et al. 2018). However these modelling studies seldom account for pathogen differences in life cycle and ploidy levels.

While quantitative resistance has gain interest (Pilet-Nayel et al. 2017), the breeding of disease-resistant plants is still often based on the gene-for-gene interaction (Person et al. 1962; Zhan et al. 2015). In the simplest case of specific response, the result of the infection is determined by a locus in the plant (the resistance gene), and in the pathogen (the avirulence gene) (Flor 1971). If the product of the avirulence gene is not recognised by the plant, the infection occurs and the plant is called *susceptible*. If it is recognised by the plant, the infection is stopped and the plant is called *resistant*. The avirulence gene exists in two versions: the avirulent *Avr* allele and the virulent *avr* allele. The plant resistance can thus be overcome by a mutation of the *Avr* allele which modifies the pathogen recognition by the plant. The *Avr* allele is then replaced by a virulent *avr* allele and the pathogen is called *virulent* (Stukenbrock et al. 2009). The constant turnover of resistance and avirulence genes results of a strong coevolutionary interaction between both species (Zhan et al. 2014), represented by the concept of arms-race (Brown et al. 2011). On both sides, the most adapted allele can spread in the population, sometimes replacing alleles conferring lower fitness to individuals (Brown et al. 2011; Persoons et al. 2017). These genes are under strong selective pressure and at each selective event a selective sweep can occur and drastically reduce the genetic diversity of both species (Oleksyk et al. 2010; Terauchi et al. 2010). In natural populations, rare host genotypes can be maintained by negative frequency-dependent selection, resulting in the preservation of host polymorphism (Lewontin 1958). In agroecosystems, however, strategies like resistance deployment hinder this maintenance of polymorphism (Zhan et al. 2015). Therefore, the issue of such deployments is often a resistance breakdown, *i.e.* the failing of the host to remain resistant to the pathogen, which can result in severe epidemics (Johnson 1984; Pink et al. 1999; Brown et al. 2011; Burdon et al. 2016). Such a resistance breakdown can occur more or less quickly, depending on the pathosystem considered and environmental conditions (Van den Bosch et al. 2003). This observation raises the question of resistance durability, that can be defined by the expected time until the apparition of a virulent population of pathogens on resistant hosts (Johnson 1984), or by the time taken by virulent pathogens to replace a population of avirulent pathogens (Van den Bosch et al. 2003; Brown 2015).

Resistance durability becomes a major economical issue when epidemics impact crop yields. Therefore, it has often been studied through the modelling of epidemics spread in agricultural land-

scapes (Rousseau 2017). Such models can couple epidemiological and evolutionary processes, and often aim to study the influence of different biological parameters on the emergence of pathogens, their specialisation to the host plant, the evolutionary dynamics of virulence, or on the resistance durability (Van den Bosch et al. 2003). These parameters can be specific to the host plant (proportion of resistant host in the landscape, their spatial and temporal distribution) or to the pathogen (life cycle, mutation rate, dispersal) (Fabre et al. 2012; Fabre et al. 2015; Papaïx et al. 2015; Soularue et al. 2017; Papaïx et al. 2018). These models often represent haploid pathogens with a virulent and an avirulent genotype, evolving purely asexually on a landscape composed of compartments, gathering resistant or susceptible hosts (Pietravalle et al. 2006; Lof et al. 2017a; Lof et al. 2017b; Pacilly et al. 2018). Regarding the pathogen, high risks of resistance breakdown are observed for pathogen populations with high gene flow and mutation rates, large effective population sizes, and partially asexual reproductions (McDonald et al. 2002). Regarding the host, the increase in the proportion of resistant hosts should increase the selection pressure, hence weakening the resistance durability (Van den Bosch et al. 2003; Pietravalle et al. 2006). However, a large proportion of resistant hosts also reduces the initial size of the pathogen population and thus the risk of resistance breakdown (Pacilly et al. 2018), partly because a small population size reduces the likelihood that a virulent individual will emerge through mutation.

However, the impact of host resistance deployment on resistance durability remains unclear when the pathogen is diploid (like rust fungi, oomycetes, or nematodes). The virulent allele is usually recessive (Stukenbrock et al. 2009; Thrall et al. 2016), consequently, a heterozygous Avr/avr individual is phenotypically avirulent. The selective advantage of the virulence is effective among homozygous avr/avr individuals only. Hence, at low frequency, avr alleles are carried by heterozygous individuals and thus mostly subjected to drift.

Diploid pathogens exhibit a large variability of life cycles (Agrios 2005). We can especially distinguish autoecious pathogens, which complete their life cycle on a unique host species, from heteroecious pathogens which need two different and successive host species to complete their life cycle (Moran 1992; Lorrain et al. 2019). This presence or absence of an alternate host species could also affect the influence of host deployment strategy on resistance durability. Moreover, most studies focus on purely asexual pathogens, but the highest risks of resistance breakdown were observed for mixed reproduction systems (McDonald et al. 2002), with the best invaders combining high rates of asexual reproduction and rare events of sex (Bazin et al. 2014). Yet, the allelic redistribution resulting from a sexual reproduction event could have an even stronger impact on resistance durability when the pathogen is diploid.

To study resistance durability and evolutionary forces shaping the system, the understanding of the evolution of gene and virulence allele frequencies is needed. Coupling epidemiology and population genetics provides insights on both short and long time scales. It allows in particular detailed analyses of transition periods (Day et al. 2004; Day et al. 2007; Bolker et al. 2010), through variables like the pathogen population size, affecting both the disease incidence in epidemiology and the impact of genetic drift in population genetics (McDonald 2004). This approach is also

crucial for highlighting transient effects like evolutionary rescue, *i.e.* the genetic adaptation of a population to a new environment, thus preventing its extinction (Martin et al. 2013). Evolutionary rescue as a process leading to resistance breakdown has not received consideration so far.

The virulence of pathogens can be associated with a fitness cost on susceptible hosts (Leach et al. 2001; Thrall et al. 2003; Montarry et al. 2010; Laine et al. 2013; Bousset et al. 2018; Nilusmas et al. 2020), sometimes referred to as the cost of pathogenicity (Sacristán et al. 2008). This fitness cost has been shown to have a strong impact on resistance durability (Fabre et al. 2012). However, depending on the avirulence gene considered, such a fitness cost is not systematic (see Leach et al. 2001 for a review). Therefore, it could be more insightful not to consider fitness cost while modelling resistance durability.

In this paper, we aim to broaden our understanding about the impact of the ploidy and the life cycle of pathogens on resistance durability. We used a non-spatialised model coupling population dynamics and population genetics to simulate the evolution of pathogens on susceptible and resistant hosts. We investigated the effects of resistant host deployment and pathogen demography on resistance durability, for a population of diploid and partially clonal pathogens, and compared the results to those obtained for haploid pathogens. Two different life cycles were implemented specifically: with or without host alternation for the sexual reproduction of the pathogen population. We assessed the resistance durability in two steps. First we examined the dynamics of fixation of the virulent allele in the population, and considered in parallel the cases when the pathogen population went extinct, to highlight evolutionary rescue events. Then we focused on the invasion and resistance breakdown events, and disentangle the relationship between the durability of resistance and the dynamics of virulent populations after the invasion.

3 Model description

3.1 Model overview

The model is individual-based, forward-time and non-spatialized, and couples population dynamics and population genetics to study the evolution of a population of pathogens for a succession of generations. It allows us to follow the evolutionary trajectory of different genotypes at the avirulence locus of pathogens through time. We consider a life cycle usually found in temperate pathogen species, which alternate rounds of clonal reproduction with an annual event of sexual reproduction (Agrios 2005). This model is designed in four variants to represent haploid or diploid pathogens with two distinct life cycles: with or without host alternation for the sexual reproduction (Figure 1). Without host alternation, the model represents the evolution in time of a population of pathogens on two host compartments: a resistant compartment (R) and a susceptible compartment (S). Fixed carrying capacities of pathogens, K_R and K_S, are respectively assigned to R and S compartments and represent the maximum amount of pathogens that each compartment can contain. With host alternation, the alternate host compartment (A) is added, where the sexual reproduction takes place. This compartment is assumed to be sufficiently large and thus with un-

bounded population size. Note that the life cycle with host alternation for haploid pathogens was added for the sake of comparison but has no real biological meaning, because no haploid pathogen display this life cycle.

3.2 Demographic evolution of the pathogen population

3.2.1 Reproduction events

Each discrete generation corresponds to a reproduction event, either sexual or asexual. Each year is composed of g non-overlapping generations, with one annual sexual reproduction event followed by a succession of $g - 1$ asexual reproduction events. In our simulations, we considered a year composed of $g = 11$ generations. At each reproduction event, parents give way to offspring and the new population is composed exclusively of new individuals.

For the sexual reproduction event, the population size is considered constant. Sexual offspring genotypes are obtained through random mating within the parental population.

For the asexual reproduction following the sexual reproduction in the A compartment in the life cycle with host alternation, the population growth is exponential, with the following relation:

$$N_{n+1} = r \times N_n \tag{1}$$

With N_{n+1} the population size at generation $n + 1$, N_n the population size at generation n, and r the growth rate of the pathogen population.

For each asexual reproduction in the R or S compartments, the population growth is logistic, with the following relation:

$$N_{n+1} = N_n + (r - 1) \times N_n \times (1 - \frac{N_n}{K}) \tag{2}$$

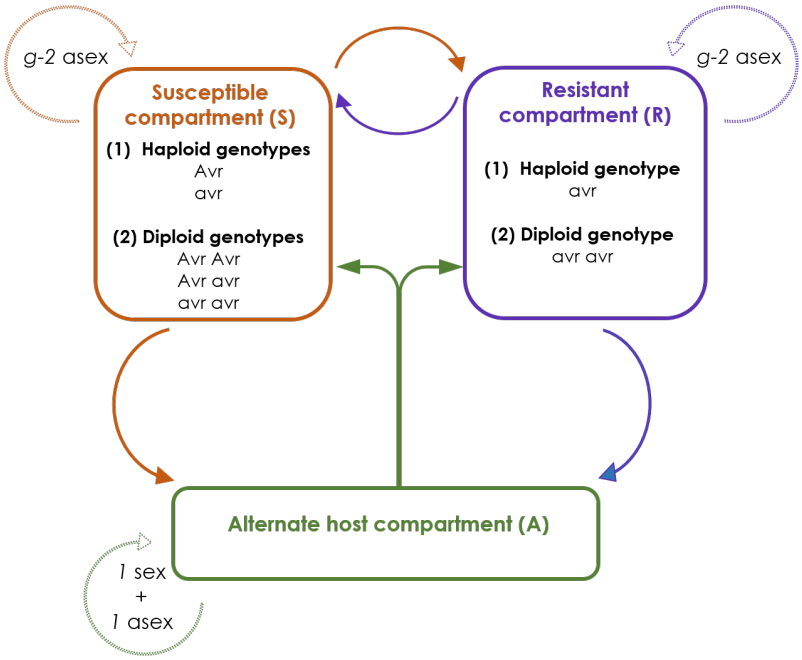
With K the carrying capacity of the compartment (K_R or K_S for R or S compartment respectively). For all clonal reproduction events, offspring genotypes are drawn randomly from the parental population, with replacement.

3.2.2 Migration events

A regular two-way migration event takes place each generation before the reproduction event, between individuals evolving in the R and S compartments. The number of migrant individuals is determined by a migration rate (mig) multiplied by the number of individuals on the compartment of origin. Migrant individuals succeed to invade the compartment of arrival, even if the number of individuals on this compartment reached the maximum carrying capacity. The population size on each compartment is restricted to the carrying capacity at each reproduction event. Thereby, this choice enables the immigration of new pathogens regardless of the size of the population, as it is observed in natural populations for plant pathogens.

For the life cycle with host alternation, the annual sexual reproduction event coincides with the obligate migration of the entire pathogen population to and from the alternate host. The first

(a) **Without** host alternation



(b) **With** host alternation

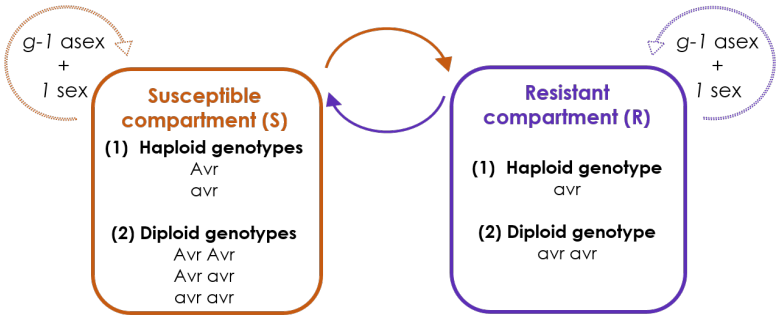


Figure 1: Model representation for two different life cycles: (a) without or (b) with host alternation. g corresponds to the total number of generations (asexual plus sexual) in a year. Dashed arrows represent reproduction events, and solid arrows represent migration events. Asex stands for asexual reproduction events, and sex for sexual reproduction events. *avr* denotes the virulent recessive allele, and *Avr* the avirulent dominant allele.

migration event takes place once every year after $g-2$ asexual reproduction events in the R and S compartments (Figure 1). For this migration event, an established proportion of individuals *Reduct* is picked randomly from R and S compartments to migrate to the A compartment. We fixed $Reduct = 0.2$ to cope to pathogen life cycles displaying drastic reduction in population size during sexual reproduction which takes place in winter. All remaining individuals die in the R and S compartments, because the sexual reproduction is mandatory to survive. After the two reproduction events (sexual and asexual) in the A compartment, the second migration event redistributes randomly all individuals from the compartment A to R and S compartments, in proportion to the relative size of R and S compartments (Figure 1).

3.3 Genetic evolution of the pathogen population

To better highlight the effect of drift among other evolutionary forces, we did not consider mutation, that is, there is no change by chance of allelic state. This amounts to study evolution of the pathogen population from standing genetic variation (Barrett et al. 2008). The avirulence gene exists at two possible states: the *Avr* allele and the *avr* allele. For haploid pathogens, the *Avr* allele leads to avirulent individuals surviving only in the S compartment (and in the A compartment in the case of host alternation), while the *avr* allele leads to virulent ones capable to survive on all compartments without any fitness cost (Leach et al. 2001; Brown 2015). For diploid pathogens, *Avr* is dominant and *avr* is recessive. Thus, individuals with genotypes Avr/Avr, Avr/avr and avr/avr survive with equal fitness in the S and A compartments, while only individuals with the virulent genotype avr/avr survive in the R compartment. Every avirulent individual (*Avr* for haploids, and Avr/Avr or Avr/avr for diploids) migrating to the R compartment dies before any subsequent migration or reproduction event.

Besides the demographic evolution of pathogen populations, the model describes the evolution of allelic and genotypic frequencies through generations in each compartment. Reproduction events can change allelic and genotypic frequencies. In particular, the annual sexual reproduction is the only event responsible for allelic reshuffling in diploid individuals. For haploid pathogens, as only one locus is studied, the sexual reproduction event amounts to an asexual reproduction, with differences in the size of the offspring population only.

3.4 Implementation of model analyses

The model was implemented in Python (version 3.7, Rossum 1995), with the package "simuPOP" (Peng et al. 2005). The starting point of each replicate simulated was a population of 2000 individuals in the susceptible compartment. A proportion f_{avr} of virulent alleles was introduced initially in the pathogen population at Hardy-Weinberg equilibrium, as standing genetic variation. All simulations were run with a fixed total carrying capacity for the host population size, $K = K_R + K_S =$ 100 000, but a variable proportion of the size of the R compartment $propR = \frac{K_R}{K}$.

Preliminary analyses were carried out to study demographic and genetic outcomes with varying

parameters. These analyses enabled six variables of interest to be identified: the initial frequency of avr allele (f_{avr}), the migration rate (mig), the growth rate (r), the proportion of resistant hosts in the landscape ($propR$), the ploidy ($Ploidy$) and the life cycle ($Cycle$). Statistical analyses were performed on simulations with quantitative input parameters picked randomly from known distributions, resulting into a random simulation design (Table 1). The same simulation design was run four times, once for each combination of categorical input parameters ($Ploidy$ and $Cycle$). To investigate further the impact of the input parameters on the simulation outcome in specific cases and to present the model results in a more didactic form, a regular simulation design was developed to complement the random design (Table 1). This regular simulation design allowed us to present the results in a more conventional form . For both the random and the regular simulation design, simulations were run for each combinations of parameters for 100 years (1 100 generations) with 100 replicates. During this period, nearly all replicates reached equilibrium (fixation of one allele or extinction of the population).

A principal component analysis was performed on the data obtained with the random simulation design using R (R 2018), on the following output variables: the frequency of extinction of population ($freq_ext$), the frequency of fixation of the Avr allele in the population ($freq_fix_Avr$), the frequency of fixation of the avr allele ($freq_fix_avr$) and the generation of fixation of avr (gen_fix_avr). To study the influence of the six input parameters ($Ploidy$, $Cycle$, f_{avr}, mig, r, and $propR$) on the three main output variables selected ($freq_ext$, $freq_fix_avr$, and gen_fix_avr), generalized linear models (GLM) were performed on R. GLM on $freq_ext$ and $freq_fix_avr$ were performed with a Logistic link function, and the GLM on gen_fix_avr was performed with a Gamma link function.

Table 1: Input parameters and their range of variations for the three simulation designs. For both the random and regular simulation designs, 100 replicates were run for each combination to analyse the equilibrium reached by the population of pathogens after 1100 generations. For the restricted simulation design, 1000 replicates were run for each combination and the allele frequencies and population sizes were monitored through all 1100 generations simulated.

Variable	Description	Random design		Regular design	Restricted design
		Distribution	Interval		
$\boldsymbol{f_{avr}}$	Initial frequency of the *avr* allele in the pathogen's population	Log-uniform	[log(0.0005), log(0.3)]	**6 levels**: 0.0005; 0.002; 0.01; 0.05; 0.15; 0.3	0.02
mig	Migration rate between R and S compartments	Log-uniform	[log(0.001), log(0.2)]	**3 levels**: 0.05; 0.1; 0.2	**2 levels**: 0.001; 0.05
r	Growth rate of the pathogen	Uniform	[1.1, 2]	**10 levels** : 1.1; 1.2; 1.3; 1.4; 1.5; 1.6; 1.7; 1.8; 1.9; 2.0	1.5
propR	Proportion of resistant hosts in the landscape	Uniform	]0, 1[	**9 levels**: 0.05; 0.1; 0.2; 0.35; 0.5; 0.65; 0.8; 0.9; 0.95	**3 levels**: 0.1; 0.5; 0.9
Ploidy	Ploidy of the pathogen	-	Haploid or Diploid	**2 levels**: Haploid; Diploid	**2 levels**: Haploid; Diploid
Cycle	Life cycle of the pathogen	-	Without or with host alternation	**2 levels**: Without host alternation; With host alternation	**2 levels**: Without host alternation; With host alternation

To analyse further the temporal dynamics of *avr* allele frequency and population size, simulations were run recording population size and allelic states over time. Because these simulations were time- and memory-consuming, they were run on a restricted simulation design with only 24 combinations of parameters (Table 1). The generation of fixation of the *avr* allele was thus decomposed into two distinct output variables: the year of invasion of the R compartment (defined in this study as the first year with at least 1‰ of the resistant compartment invaded by pathogens, the pathogen population being then considered detectable on resistant hosts) and the time elapsed between the invasion and the *avr* allele fixation in the population. The influence of three parameters (*propR*, *Ploidy* and *Cycle*) on these two output variables was studied with 1000 replicates for each combination through 1100 generations. For these two output variables, GLM were performed with a Gamma link function.

For each general linear model developed, a dominance analysis was performed with the R package "dominanceanalysis" (Bustos Navarrete et al. 2020) to compare the relative importance of the input parameters on the five output variables described. Estimated general dominance were calculated using bootstrap average values with the corresponding standard errors for each predictor with 100 bootstrap resamples, with McFadden's indices (McFadden 1974).

Calculations of a growth rate threshold r_0 were carried out on Python for several parameter combinations. This value determines the growth rate below which the population goes extinct before the end of the simulation if there are no virulent individuals, therefore if the R compartment remains empty.

4 Results

4.1 Model behaviour

Since the model leads to stochastic outputs, we first analysed model behaviour in order to identify sound output variables. We visualised both population size and allele frequency dynamics through generations. The trajectory of each simulation either lead to the extinction of the entire pathogen population or to the fixation of one allele, provided that simulations last long enough. An example of such model behaviour is illustrated in (Annex B Figure S2) with five replicates, assuming diploid pathogens with host alternation. In this example, population sizes display cyclical dynamics due to the annual migration event on the A compartment. Three out of five replicates lead to population extinctions, while in the two other replicates, some pathogen individuals succeed to invade the R compartment after the initial phase of population dynamics collapse, leading to the fixation of the *avr* allele. These two dynamics with the survival of the population following a genetic adaptation to harsh environment illustrates evolutionary rescue. Interestingly, all replicates succeed to invade the R compartment at some time, but - because of host alternation - the annual redistribution of individuals breaks the invasion dynamics of the R compartment. Therefore, invasion does not necessarily lead to *avr* fixation.

In the following, we will summarise simulation results with four output variables, computed

over replicates: the frequency of extinction, $freq_ext$; the frequency of fixation of Avr or avr allele, $freq_fix_Avr$ or $freq_fix_avr$, respectively; and the generation of fixation of avr allele, gen_fix_avr. The later output variable provides insights on the durability of resistance.

4.2 Sensitivity analyses

To identify the most significant parameters on the different output variables, we conducted a PCA analysis, general linear models and dominance analyses.

The PCA analysis was performed on the four output variables, with the first and second axis accounting for 49.5% and 33.3% of the total variability respectively (Figure 2). The most influential parameters of interest on the output variables were the growth rate r, negatively correlated with the frequency of extinction of population $freq_ext$. The initial frequency of avr alleles in the population f_{avr} was positively correlated with the frequency of fixation of the avr allele $freq_fix_avr$. The migration rate mig and the proportion of resistant hosts in the landscape $propR$ were negatively correlated with both the frequency of fixation of the Avr allele $freq_fix_Avr$, and the generation of fixation of the avr allele gen_fix_avr. The qualitative input parameters ($Ploidy$ and $Cycle$) were studied by representing each of the combinations of parameters of the random simulation design colored according to its ploidy and life cycle (Figure 2.b). This PCA highlights a higher frequency of extinctions of population for diploids with host alternation. Moreover, simulations without host alternation lead to higher frequencies of fixation of Avr, and higher mean generations of avr fixation. The ellipses also illustrate that haploid individuals with host alternation lead to less variable outcomes and to higher frequencies of fixation of avr.

Dominance analyses highlight the high impact of r on $freq_ext$ (Figure 3.a), which is confirmed by the analysis of Sobol indices (Annex A Figure S1)). For $freq_fix_avr$ and gen_fix_avr, the influence of model parameters is more balanced with a lower contribution of the input parameters on gen_fix_avr (Figure 3.b, c). Overall, this analysis points out that $freq_ext$ and $freq_fix_avr$ are relatively well explained while gen_fix_avr is more stochastic.

4.3 Patterns of virulence fixation

Three different and exclusive equilibria are observed: the extinction of the pathogen population, the fixation of the avr allele and the fixation of the Avr allele. The frequencies of these outputs among replicates are represented depending on f_{avr}, r, $propR$ and $Cycle$, for haploids and diploids (Figure 4, Annex B Figure S5). For both ploidy levels, there is an increase in the frequency of fixation of the avr allele with the increase in f_{avr} and r. This representation also highlights the existence of a growth rate threshold r_0 above which there is fixation of either the avr allele or the Avr allele, and below which there is instead either fixation of the avr allele or extinction of the population. In other words, for a growth rate below r_0 the pathogen population only survives when virulent individuals invade the R compartment, which corresponds to evolutionary rescue. Evolutionary rescue is particularly noticeable for the life cycle with host alternation because in

(a) Correlation circle (b) Individual representation

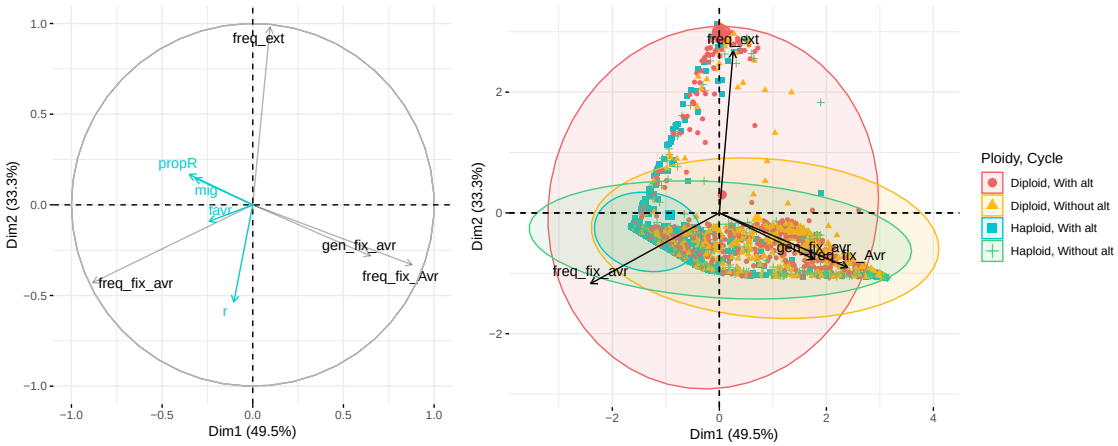


Figure 2: Principal component analysis on four output variables: ($freq_ext$, $freq_fix_Avr$, $freq_fix_avr$, and gen_fix_avr). Two results are displayed: (a) the correlation circle on four output variables. The quantitative parameters f_{avr}, mig, r, and $propR$ are represented informatively in blue on the correlation circle and do not contribute to the variability. (b) the individual representation of simulations which represents the influence of the pathogen ploidy and life cycle. Each point represents a different combination of parameters with 100 replicates. Ellipses correspond to the 95% multivariate distribution.

(a) (b) (c)

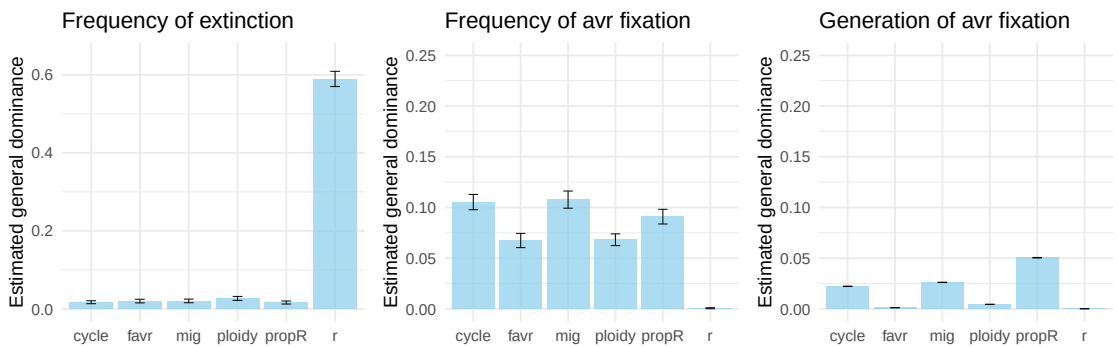


Figure 3: Estimated general dominance of each predictor calculated from general linear models applied to three output variables of the random simulation design: the frequency of extinction of population, the frequency of fixation of the avr allele among replicates with surviving populations, and the generation of fixation of the avr allele. For each predictor the general dominance was estimated from bootstrap average values with the corresponding standard error for 100 bootstrap resamples.

this case, r_0 increases with *propR*.

Above r_0, we observe a gradient between the predominant fixation of the two alleles depending of f_{avr}, with slightly different patterns influenced by *propR*, *Cycle* and r for diploids (Figure 4). The influence of the life cycle on the fixation pattern is the most noticeable for low values of *propR* and r. The frequency of fixation of the *avr* allele appears maximal for intermediate values of *propR*.

To examine further the influence of *propR* on the probability of fixation of the *avr* allele, we plotted the evolution of the frequency of fixation of the *avr* allele among all replicates of the regular simulation design depending on *propR* and r for a fixed value of f_{avr} (Figure 5). For haploid individuals with host alternation, the frequency of fixation of the *avr* allele increases very slightly with *propR*. For haploids without host alternation, a plateau is observed for intermediate values of *propR*. For diploids, the distribution is shifted with a peak of maximal proportion of *avr* fixation for a slightly lower value of *propR*.

4.4 Variations in the speed of virulence spread

To analyse in more details the dynamics of virulence spread, we examine two time points, reflecting two measures of resistance durability: the invasion of the R compartment and the resistance breakdown event. Invasion and resistance breakdown were defined as the first year when at least 1‰ and 1% of the resistant compartment were occupied by pathogens, respectively. Distributions of these two measures of resistance durability were plotted for three values of *propR*, with and without host alternation, only for the replicates for which we observed eventually a fixation of the *avr* allele. To broaden the picture, we monitored also the evolutionary trajectory of the *avr* allele from the invasion of the R compartment. The dynamics of invasion is mainly driven by the ploidy level and the dynamics of virulence spread is mainly driven by *propR* (Annex B Figure S3).

For haploid individuals resistance breakdown occur very rapidly: during the first or second year of simulation, regardless of the life cycle (figure not shown). There is a small delay in the time of the resistance breakdown with the increase in *propR*, especially without host alternation.

For diploid individuals, we observed longer periods before invasion and resistance breakdown and higher kurtosis. Assuming a strong migration rate, there are little differences between life cycles on the time of invasion. Both life cycles display an increase in kurtosis that goes hand in hand with the increase in *propR*. Without host alternation, distributions of the year of resistance breakdown and invasion time are similar, but with a one-year lag. Conversely, with host alternation, there are strong changes in the distributions that flatten out when considering the year of resistance breakdown (Figure 6). Assuming a low migration rate (i.e. for telluric pathogens), distributions of the year of invasion and resistance breakdown remain unchanged with host alternation, while these distributions flatten out considerably without host alternation (Annex B Figure S4). Note that in both migration regimes, with host alternation we observe a bimodal distribution of invasion year for $propR = 0.9$, with many invasion events in the first year of simulations. Early invasion events result from the initial redistribution of pathogen individuals following sexual reproduction on the

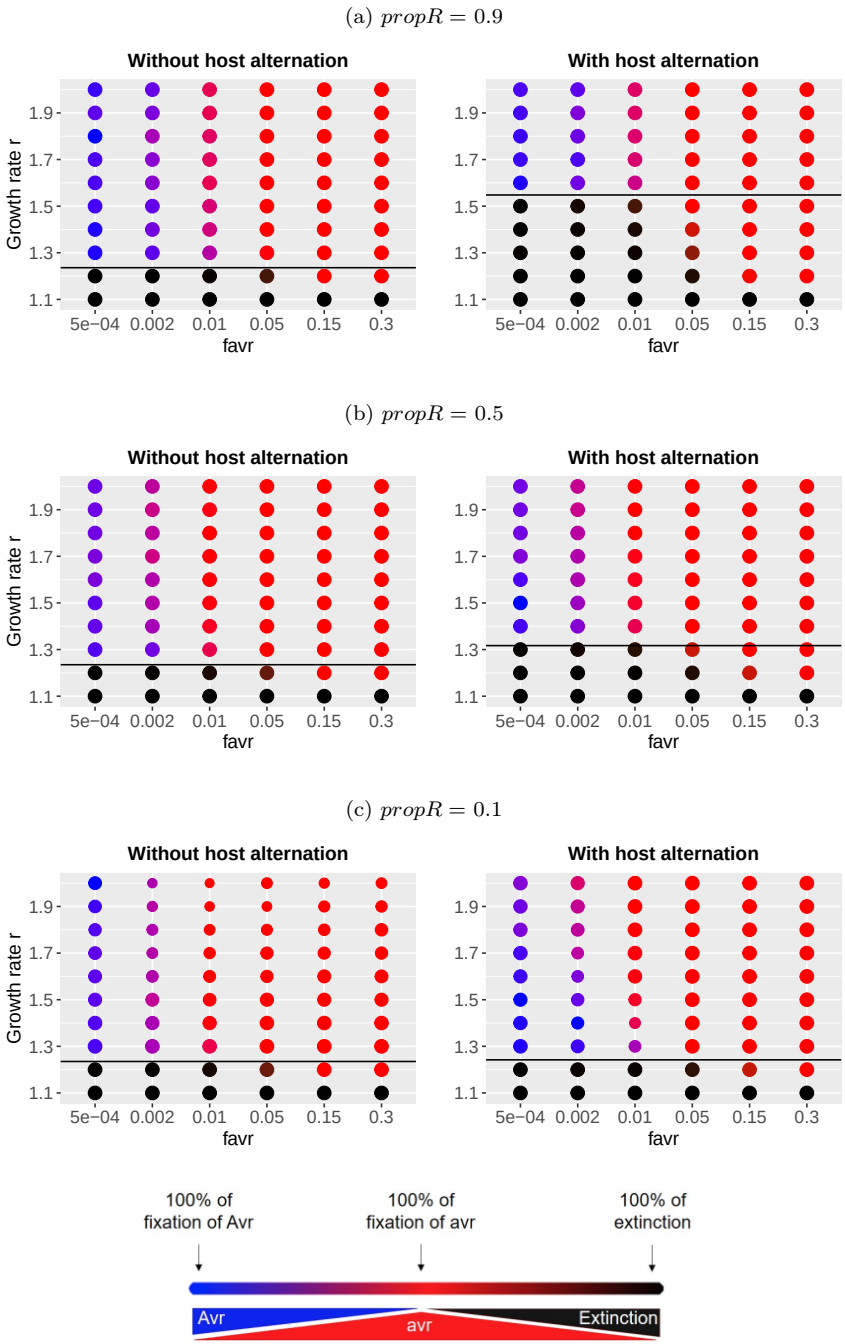


Figure 4: For diploid pathogens, representation of the frequencies of population extinction or fixation of alleles *Avr* or *avr* for each combination of four parameters: f_{avr}, r, $propR$ and $cycle$, with $mig = 0.05$. On each graph the black line corresponds to the calculated value of the growth rate threshold r_0 below which the population dies if it does not expand to the R compartment. The surface of each plotted result is proportional to the number of simulations, among the 100 replicates, for which an equilibrium was reached at the end of the 1100 generations simulated.

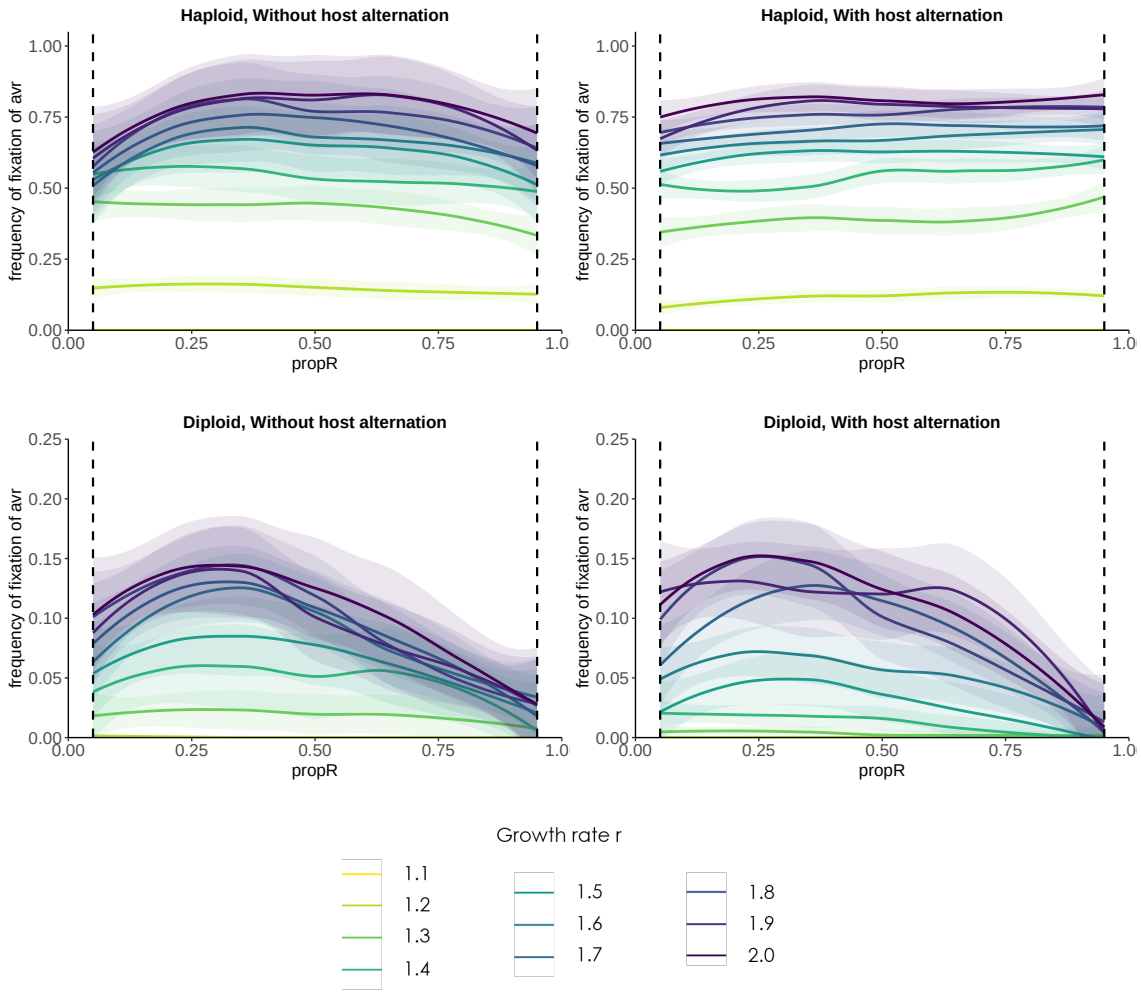


Figure 5: Evolution of the frequency of fixation of the *avr* allele depending on *propR* for r varying between 1.1 and 2.0, with $f_{avr} = 0.0005$. Simulations were performed without and with host alternation, for haploid and diploid individuals, with 100 replicates for each combination of parameters. The plotted results correspond to the local regression on the frequency of fixation of the *avr* allele with the 95% confidence intervals associated with each regression. The vertical dotted lines correspond to the bounds of simulated values of *propR* for this regular experimental design.

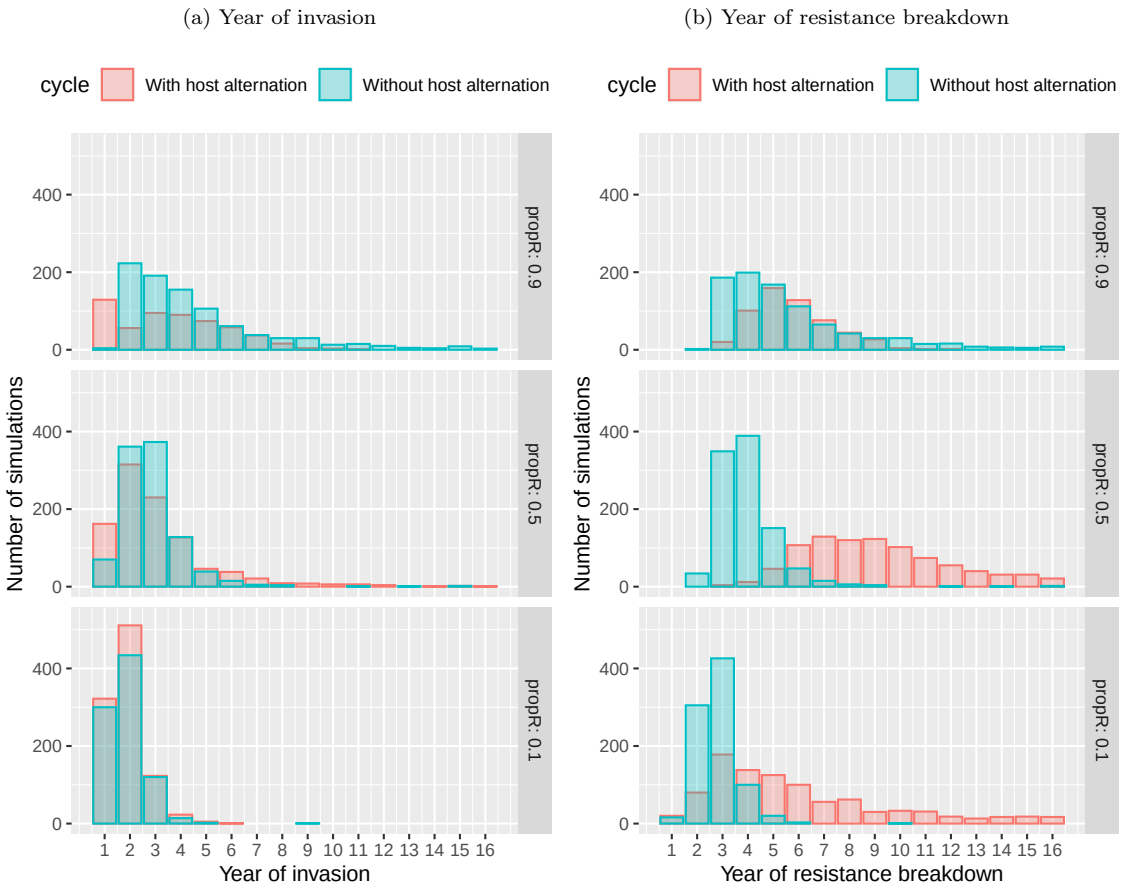


Figure 6: Histograms of (a) the year of invasion and (b) the year of resistance breakdown depending on the life cycle of the diploid pathogen, for three values of *propR*. Simulations were performed with $f_{avr} = 0.02$, $mig = 0.05$, and $r = 1.5$. The plotted results were obtained from the restricted simulation design, and correspond to all simulations among the 1 000 replicates per combinations for which we observed a fixation of the *avr* allele in the population.

alternate host: it is all the more likely that a virulent individual arrives on the R compartment the more predominant it is in the landscape.

In a last step, the evolution of the frequency of the *avr* allele in the population was studied along with the evolution of the population sizes through generations, from the invasion (Figure 7, see Annex B Figure S6 for haploids). For both life cycles, we observe an increase in the speed of fixation of the *avr* allele with the increase in *propR*. The median speed of fixation is higher with host alternation for haploids, and highly dependant of *propR* without host alternation for diploids (Annex B Figure S3). We also observe differences in stochasticity levels depending on the ploidy and the life cycle. For haploids, the dynamics of virulence fixation is almost deterministic. For diploids, the dynamics are more variable, with a highly stochastic behaviour for the life cycle with host alternation. Moreover, the GLM results, the dominance analysis and the comparison of both figures show that independently of *propR* and of the life cycle, the increase in the proportion of *avr* allele is faster for haploid than for diploid individuals.

Focusing on diploid simulations, Figure 7.b highlights the existence of an evolutionary rescue effect, for the life cycle with host alternation and a high value of *propR*. The median population size decreases through time and almost reached 0 before the 20th generation following the invasion, when an increase in the proportion of *avr* alleles lead to an increase in the population size in the R compartment, followed by an increase in the population size of the S compartment, preventing the extinction of the population.

Interestingly, the speed of invasion is mainly driven by the ploidy, while the speed of fixation of the *avr* allele from the invasion is mainly driven by the landscape composition *propR* (Annex B Figure S3).

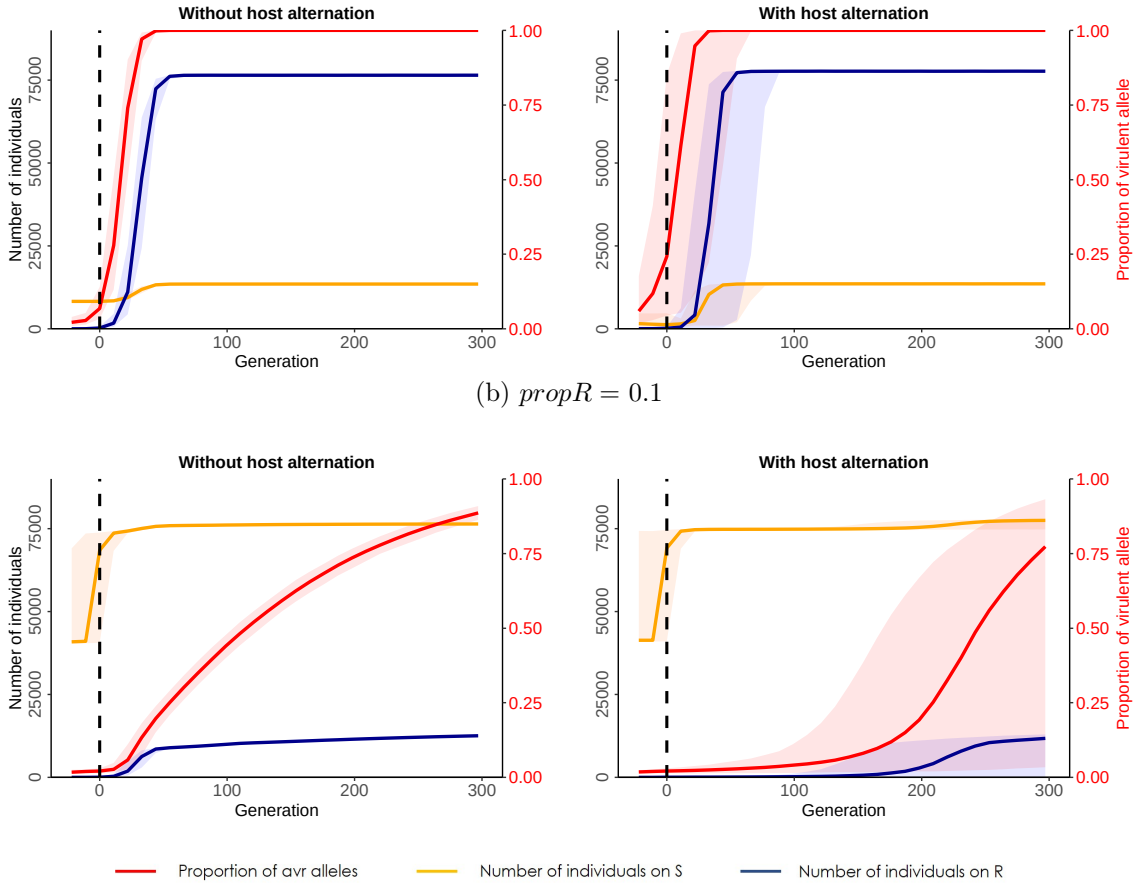
5 Discussion

5.1 Deep impact of the ploidy on resistance durability

Lof et al. 2017b demonstrated that the pre-existence of virulent alleles in the pathogen population could greatly diminish resistance durability. In the present study, we varied the initial frequency of *avr* alleles in the population but focused only on cases where this allele was already present at the beginning of the simulation, which corresponds to standing genetic variation (Barrett et al. 2008; Alexander et al. 2014). Our results illustrated a strong positive relationship between the initial frequency of virulent alleles and the probability of invasion and resistance breakdown. For haploid individuals, we found no stochasticity in the time of occurrence of the invasion, which occurred in the first year of the simulation for all replicates. Thus, for simulations with haploid pathogens, almost as soon as one virulent individual invaded the resistant compartment, it was selected and the resistance breakdown occurred. This result explains why a lot of models on haploid individuals focus on the probability of apparition of the first virulent individual, in particular by mutation (Fabre et al. 2015; Papaïx et al. 2015). Our results for simulations with haploid pathogens also highlighted low stochasticity in the increase in the proportion of virulent alleles in the population after the invasion. The results obtained with haploids were consistent with previous studies on resistance durability (Pacilly et al. 2018), which permitted us to consider this model as the reference model, in order to study the influence of the diploid state on the system dynamics. Diploid individuals, however, display strongly different evolutionary trajectories. In particular, we observed higher stochasticities in the evolution of the virulent allele frequency, both before and after the resistance breakdown. This is mainly caused by the recessivity of the *avr* allele, according to the gene-for-gene model. Before the invasion, the *avr* allele is rare and mostly at the heterozygous state, hence leading to phenotypically avirulent individuals. At this state, the *avr* allele cannot be selected, and variations in its frequency are only driven by genetic drift, which induces high stochasticity among replicates. This effect should be strengthened in species with small effective population sizes, such as in cyst nematodes (Gracianne et al. 2016; Montarry et al. 2019).

As a consequence, we observed lower frequencies of *avr* fixation and higher extinction rates for

(a) $propR = 0.9$



(b) $propR = 0.1$

Figure 7: For **diploid** pathogens, evolution of the population size in the R and S compartments (on the left scale) and of the frequency or *avr* alleles in the S compartment (on the right scale) through generations. Simulations were performed without and with host alternation, for two values of $propR$: (a) 0.1 and (b) 0.9, with $f_{avr} = 0.02$, $mig = 0.05$, and $r = 1.5$. For each simulation, generation 0 corresponds to the generation at which the invasion occurred. For each combination of parameters, simulations were performed on 1 000 replicates. The plotted results correspond to the median results (frequency of *avr* alleles or population size) for all simulations among the 1 000 replicates for which we observed a fixation of the *avr* allele in the population. Coloured intervals correspond to the 95% confidence intervals.

diploid individuals, independently of the life cycle and the host deployment strategy. Moreover, simulations with diploid pathogens resulted in lower speeds of fixation of the virulent allele, that is, higher resistance durability. Because of the heterozygous Avr/avr state, avr alleles are not necessarily selected and their presence in the population does not inevitably lead to an immediate resistance breakdown, as observed for haploid individuals. Thus, besides its impact on the stochasticity of the results, the vulnerability of the virulent allele at the heterozygous state is also responsible for an increase in resistance durability. The impact of the landscape composition on resistance durability also differs with the ploidy. Consistently with the work of Van den Bosch et al. 2003 and Pietravalle et al. 2006, for haploid individuals the increase in $propR$ leads to a strong increase in the speed of fixation of the avr allele, thus decreasing the resistance durability. In all cases except for haploids with host alternation, this result was accompanied in the present study by a maximum frequency of avr fixation for intermediate values of $propR$. This non-linear relationship is similar to the one highlighted for haploids by Pacilly et al. 2018, and is caused by two distinct mechanisms. At low proportions of resistant hosts in the landscape, the selective pressure on the avr allele is sufficiently low to limit the increase in the virulence in the pathogen population. At high values of $propR$, the opposition between selection and drift is magnified: on one hand the selective pressure is high and imposes a rapid pace of adaptation; on the other hand the small size of the S compartment increases genetic drift and the risk of extinction of the avr allele, provided that the R compartment is not invaded. Hence, in most cases the virulent allele is lost if it does not spread quickly enough in the population: either $r > r_0$ which lead to a fixation of the avirulent Avr allele, either $r < r_0$ and the population goes extinct. Therefore, it would be possible to reduce the probability of invasion for diploid pathogens with either very low or very high proportions of resistant hosts in the landscape. However the increase in the proportion of resistant hosts is at the risk of weaker resistance durability: if the resistance breakdown occurs, it occurs more rapidly. For haploid pathogens with host alternation, we observed an almost constant and slightly increasing frequency of fixation of avr with the increase in $propR$. In this case and contrary to diploids with host alternation, the increase in the proportion of avr alleles on the resistant host is not counteracted by the allele reshuffling during the sexual reproduction event on the alternate host. For diploids, this allelic reshuffling causes a rise in the number of phenotypically avirulent Avr/avr heterozygous individuals, which will die if the redistribution following the sexual reproduction lead them on the resistant host. This can result in a drastic drop in the avr allele proportion while for haploids, the proportion of resistant hosts in the landscape does not increase the mortality rate of individuals carrying the virulent allele, because these haploid individuals are necessarily surviving on the resistant host.

5.2 Life cycles impose different selection regimes and lead to contrasted evolutionary trajectories

The two different life cycles considered in this study - with or without host alternation - can be assimilated to hard and soft selection respectively (Wallace 1975; Bugge Christiansen 1975). Soft

selection is expected to protect polymorphims, and hence promote local adaptation, while hard selection resembles an all or nothing game, that is to adapt to the encountered environment or to perish. Here host alternation leads to faster evolution of allelic frequencies, with higher speeds of virulence fixation. Without host alternation on the contrary, the evolution of virulence alleles are buffered, which results in slower dynamics. The increase in gene flow resulting from host alternation limits natural selection and local adaptation (Lenormand 2002), especially because of the dispersal of non-adapted individuals on resistant hosts. The life cycle with host alternation is thus characterized by higher probabilities of population extinctions, and strong dependency of the growth rate threshold r_0 and the landscape composition $propR$. For diploids with host alternation, contrary to the local adaptation on each compartment without host alternation, the forced allelic reshuffling on the alternate host is responsible for the increase in the number of Avr/avr heterozygous individuals. Because the avr allele is recessive, a large proportion of these newly-produced individuals die from the redistribution on the resistant compartment following the sexual reproduction. Noticeably, the reduction in virulence fixation at high proportions of resistant host discussed above hence results from two mechanisms in diploids: impediment of local adaptation without host alternation or increase in selective pressure with host alternation.

For diploid individuals, we also observed contrasting patterns of variation in the evolution of the avr allele frequency before and after the invasion, depending on the life cycle. The time of invasion is more stochastic without host alternation, while the speed of increase in the avr allele frequency from the invasion is far more stochastic with host alternation. The first step relies essentially on the probability of encounter between a virulent individual and a resistant host. Without host alternation the encounter is restrained to the probability that a virulent individual migrates from the susceptible to the resistant host during the vegetative season. The host alternation reinforces gene-flow, with the annual migration event that redistributes pathogen individuals among all host plants, thereby favoring the encounter. Interestingly, in the case of host alternation, early infections of resistant host (invasion) does not readily translate into population establishment on that host (disease outbreak leading to resistance breakdown). At the end of the vegetative season and initial invasion, the sexual reproduction on alternate host reshuffles allele frequencies, and thus breaks virulent (homozygous) individuals into mostly avirulent (heterozygous) individuals. These up and down selection phases amplify the effect of genetic drift and lead to nearly chaotic evolutionary trajectories, resulting in a resistance durability all the more difficult to predict. Without host alternation, virulent individuals mate with each others and the homozygous state is sheltered, which results in a strict time lag between initial invasion and population outbreak. Overall our model is in accordance with the framework proposed by McDonald et al. 2002 which highlights the importance of gene flow as an impediment to resistance durability. Our analysis completes this framework, taking into account the variation in life cycles.

The life cycle also plays a role in the frequency of observation of evolutionary rescue effects. Carolan et al. 2017 highlighted the impact of the growth rate of the pathogen on resistance durability, by presenting the limitation of the growth rate as a mean to increase resistance durability.

In accordance with this study, we displayed a growth rate threshold r_0 below which the pathogen population goes extinct if it does not invade the resistant compartment. Hence, for a growth rate below r_0, the genetic adaptation of the pathogen population is the only way for the population to survive, which is a classical example of evolutionary rescue. In the current study, r_0, and thus the observation range of evolutionary rescue, is highly dependent on the life cycle. Without host alternation, the redistribution of individuals between compartments and the mortality rate is limited, which leads to a quite low r_0, independently of the proportion of resistant hosts in the landscape. With host alternation, however, the redistribution event occurring each year from the alternate host to the S and R compartments leads to a strong dependence of r_0 on the landscape composition, with an increase in the observation range of evolutionary rescue with the proportion of resistant hosts.

5.3 Conclusion

Short-term epidemiological control is predicted to be optimal for a landscape composed of a high proportion of resistant hosts in a low degree of spatial aggregation (Holt et al. 1999; Skelsey et al. 2010; Papaïx et al. 2014; Papaïx et al. 2014; Papaïx et al. 2018). However, Pink et al. 1999; Pietravalle et al. 2006; Fabre et al. 2012; Papaïx et al. 2018 also highlighted that optimal resistance durability could be obtained by reducing the proportion of resistant hosts, thus minimizing the selection pressure on the pathogen population. In the current study, the minimization of the probability of fixation of the virulent allele for a diploid pathogen population was obtained either at very low or very high proportions of resistant hosts in the landscape. In cases where the population does not go extinct and the virulent allele increases in proportion, however, the proportion of resistant hosts in the landscape strongly impacts the speed of increase, and thus the resistance durability. Consistently with Van den Bosch et al. 2003, we displayed that for a diploid pathogen population with standing genetic variation, the increase in the proportion of resistant hosts decreases resistance durability. In particular, with host alternation both the invasion and the fixation of the virulent allele in the population can occur very quickly. However, in such a case, the evolutionary trajectory of the virulent allele is all the more stochastic and durability is thus difficult to predict. Without host alternation (i.e. for the majority of pathogen species) early detection and population control measures would increase resistance durability. However such prophylactic measures are made all the more difficult by the strong unpredictability of the invasion date. For the few species with host alternation, a massive intervention could durably control a population of pathogens, such as the eradication of the alternate host species *Berberis vulgaris* for wheat stem rust control (Peterson 2018). Overall, the high stochasticity of evolutionary trajectory impedes accurate forecasts of resistance durability for diploid organisms.

5.4 Perspectives

In the current study, we considered a single qualitative resistance gene. The combination of several resistance genes is often studied and deployed to increase resistance durability (Djian-Caporalino et al. 2014; Mundt 2014; Djidjou-Demasse et al. 2017; Rimbaud et al. 2018). These combinations of resistances can occur at the plant scale with multiple resistance genes (pyramiding) inside one host genotype, or at the landscape scale with multiple resistance deployments in time or space (Mundt 2002; Van den Bosch et al. 2003). Some resistant cultivars progressively introduced in the landscape are composed of different combinations of qualitative resistance genes, resulting in an evolving selective pressure through time (Goyeau et al. 2011). Building on our results, we can extrapolate on the impact of the ploidy and the life cycle on resistance durability for these different strategies of deployment. Hence, rotating cultures with different resistances would amount to force gene flow, favoring the encounter of pathogen individuals with new hosts without an actual migration. This would be comparable to the hard selection regime observed with host alternation, and we expect similar results. With the pyramiding of several resistance genes in same host, meanwhile, we would expect a higher short term efficiency than with a single resistance, but with a higher risk of rapid resistance breakdown by multivirulent individuals due to the inducing of a strong selective pressure, especially for pathogens with host alternation.

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