

Bioeconomic modelling  
of spatial spread and control  
of forest epidemics:  
Policy-driven and voluntary strategies



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# Plan of the talk

## How can models support risk assessment of plant pests and decision making?

- Introduction: Modelling
- Model 1: Prevention vs control on a gradient
- Model 2: Control on a landscape
- Conclusions



*Conventional disease ecology models treat human behaviors as external to the disease system, whereas bioeconomic analysis treats behavior as an internal component of a jointly determined human-disease ecology system.*

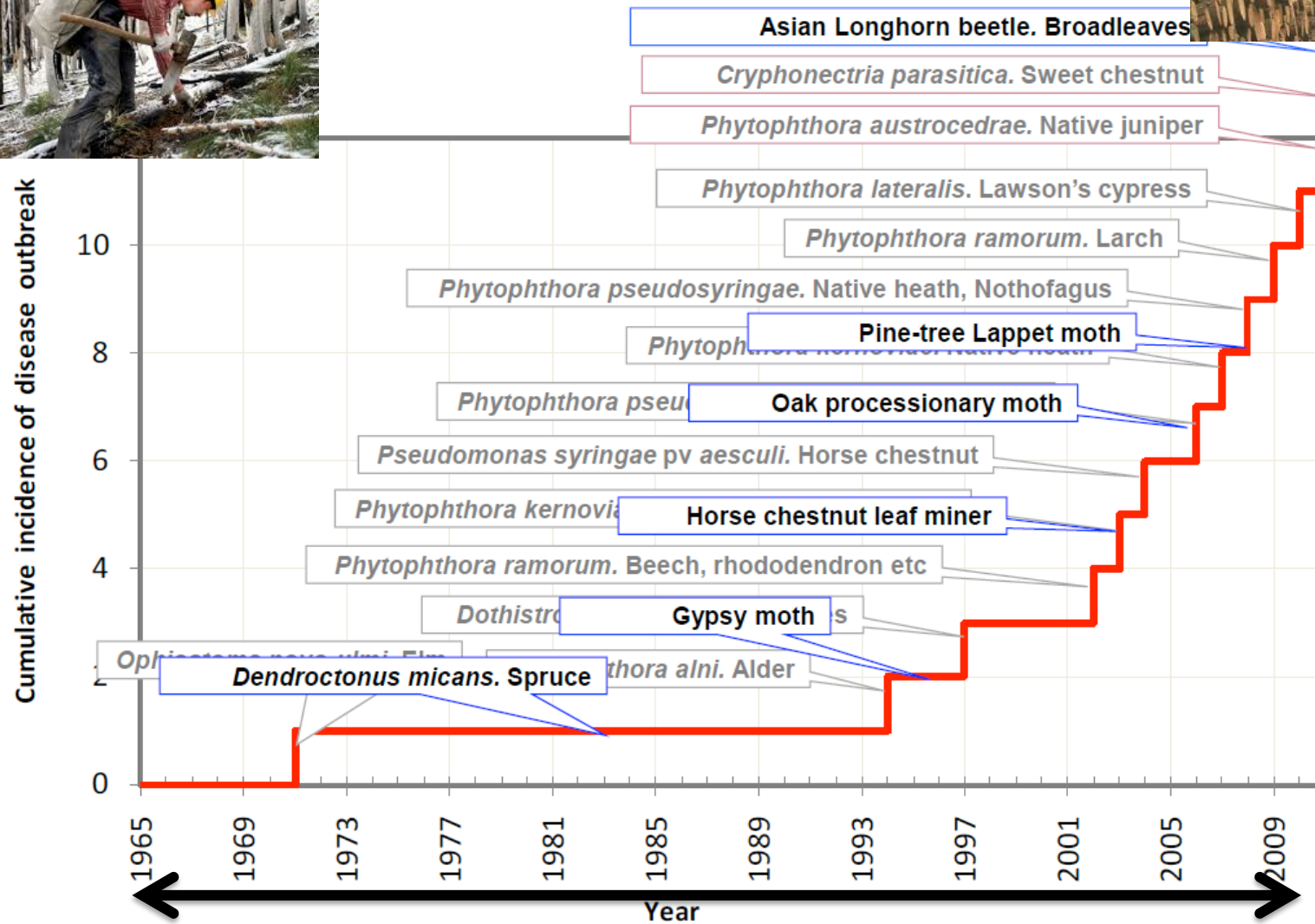
Horan et al 2010

*[Models] should allow decision makers to determine the point at which to switch between eradication, containment, and learning to live with a problem based on economic, social, environmental, political, technical and legal considerations.*

DEFRA TTI call for proposals 2016

Photo courtesy of S Hendry, FR

# Background



45 years

Images: Plant Health Task Force

# Bio-economic modelling

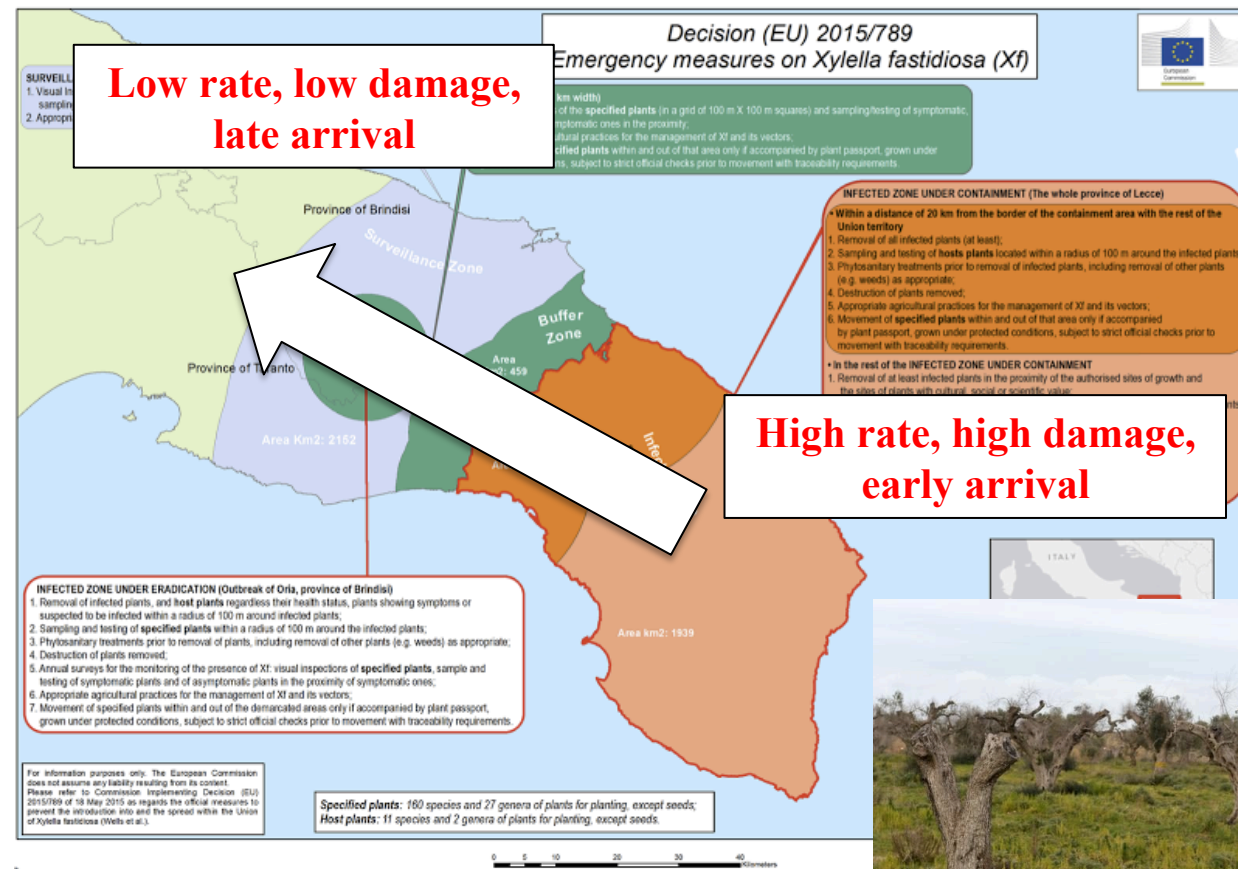
## How can models support risk assessment of plant pests and decision making?

- Forest owner responding to a threat by emerging disease/pest
- Assess the risks:
  - How probable is it that pest/pathogen will invade?
  - When will it invade?
  - How fast will it spread?
  - What is its potential impact?
  - What control strategies are available and how much would they cost?
- How is this information gathered?
- Make decision:
  - What is the balance between costs and benefits of any action?
  - Which strategy to choose or whether to do nothing?
  - How does my decision depend on neighbours?
  - How does my decision impact on neighbours



# Model 1: Prevention or treatment

- How does owners perception of disease change the balance between prevention, treatment or 'live with a disease' option?



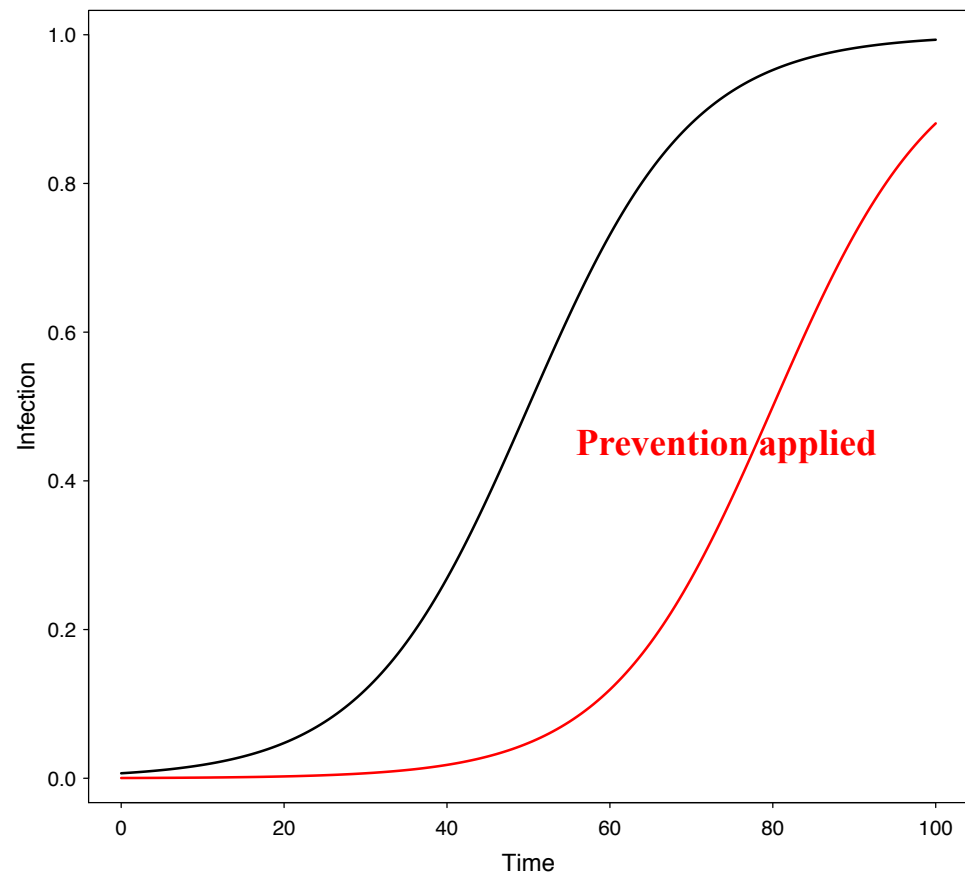
# Model 1: Prevention or treatment

- Mature forest with continuous cropping or amenity forest
- Single population on a disease intensity gradient
- SI model with primary infection rate

$$\begin{cases} \frac{dS(t)}{dt} = -\beta[I(t) + \delta \varepsilon]S(t) \\ \frac{dI(t)}{dt} = \beta[I(t) + \delta \varepsilon]S(t) \end{cases}$$

$$\delta = 1 - \frac{c_P}{B}$$

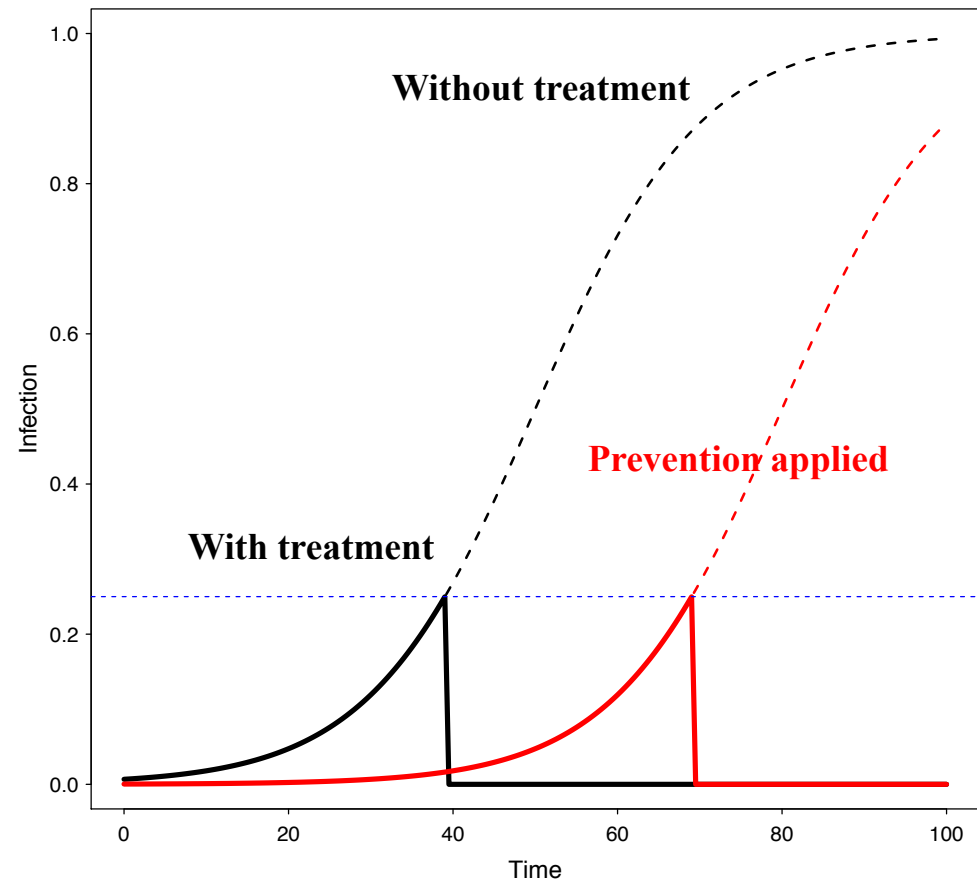
- Prevention delays the arrival
  - voluntary
  - depends on investment level



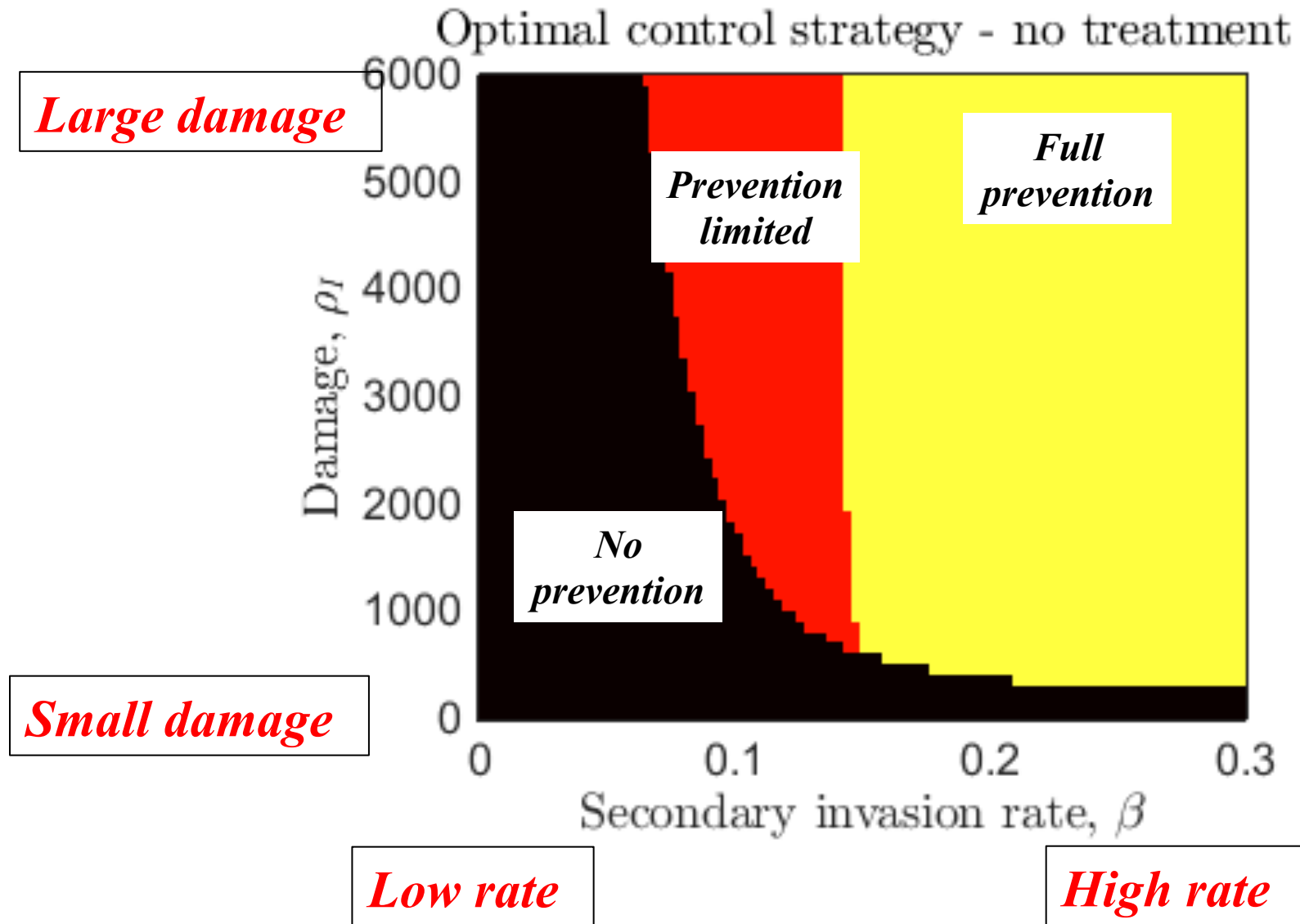
# Model 1: Prevention or treatment

- Treatment eradicates the disease already present
  - compulsory
  - threshold
- Minimise total loss subject to spread of disease:
  - prevention cost (all the time)
  - infection cost (while infection is present)
  - treatment (applied once)

$$\min_{0 \leq c_P \leq B} J(c_P, T) = \int_0^{\infty} e^{-dt} c_P L dt + \int_0^{\tau} e^{-dt} c_I I(t) dt + e^{-d\tau} c_T L$$

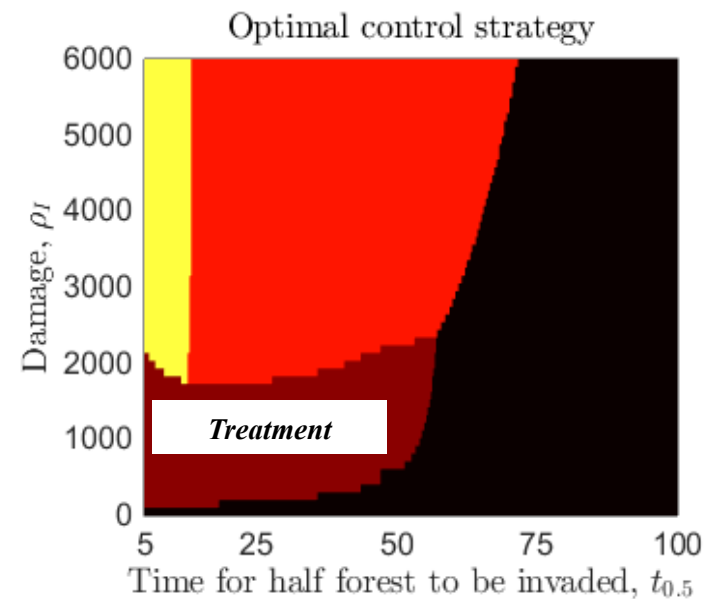
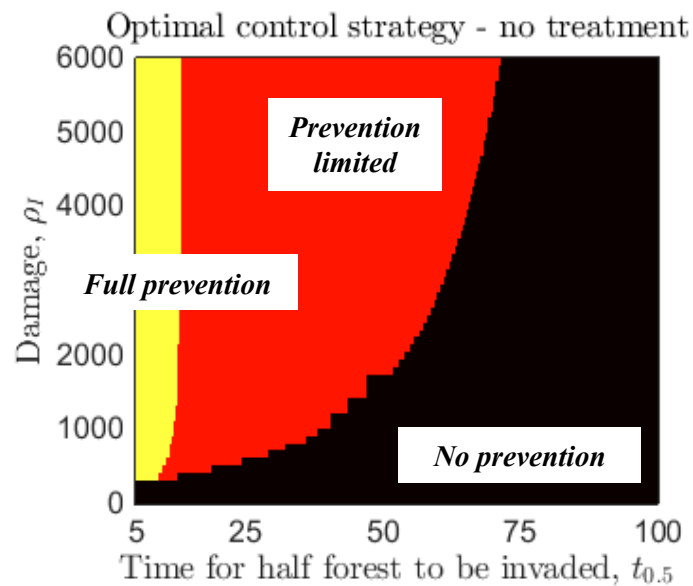
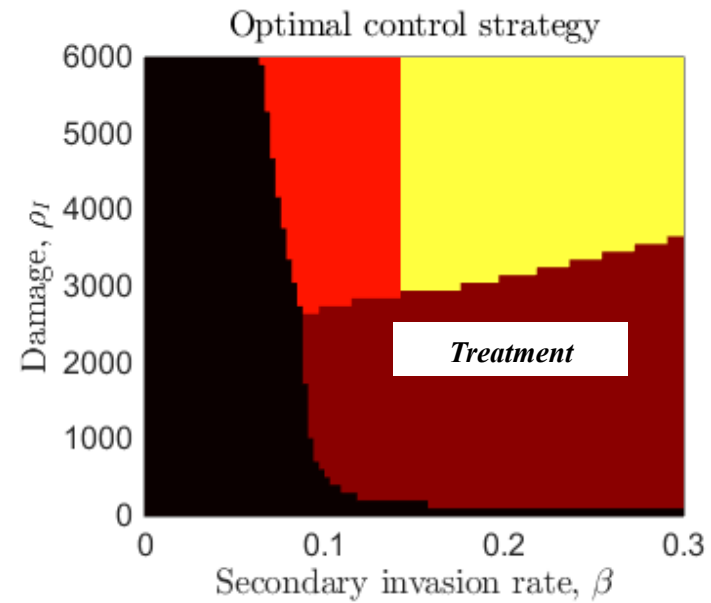
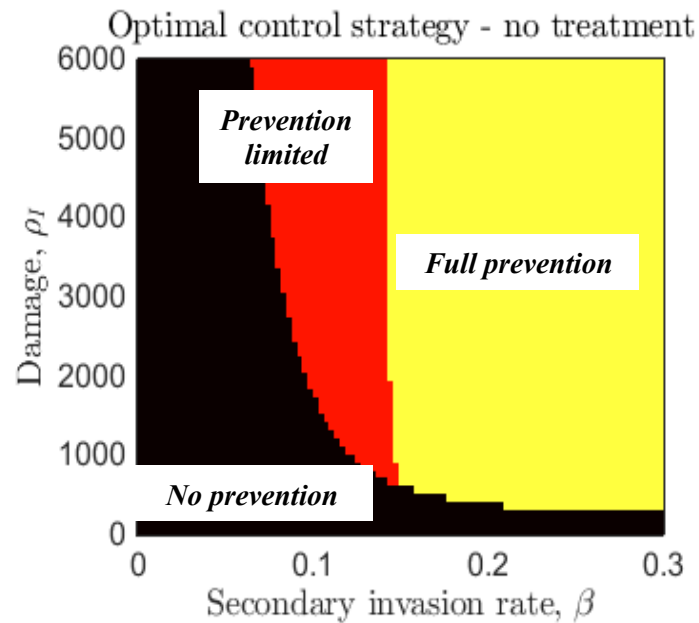


# Model 1: Prevention





# Model 1: Prevention or treatment

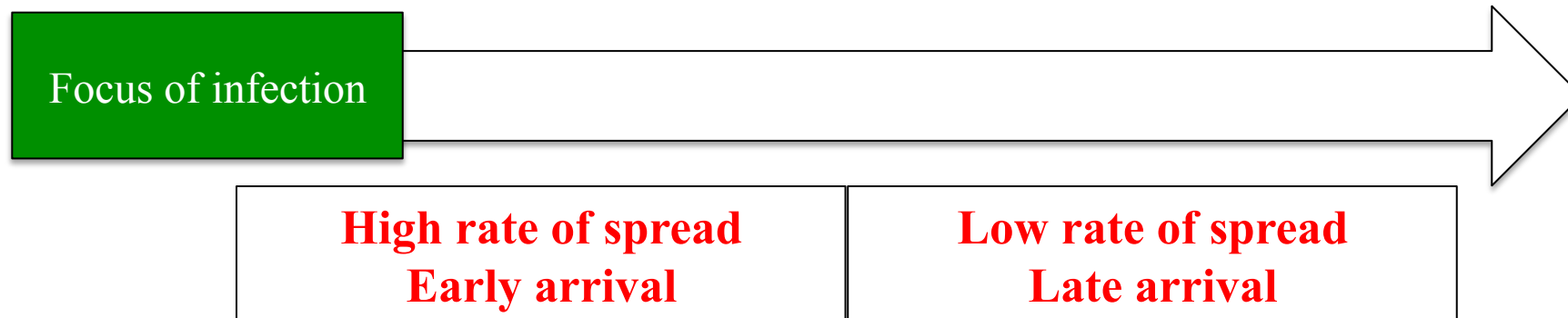


# Model 1: Summary

- Zoning emerges from bioeconomic models:

- Close to disease focus:
- if treatment available, forego prevention and treat
- if not, concentrate on prevention and invest all budget

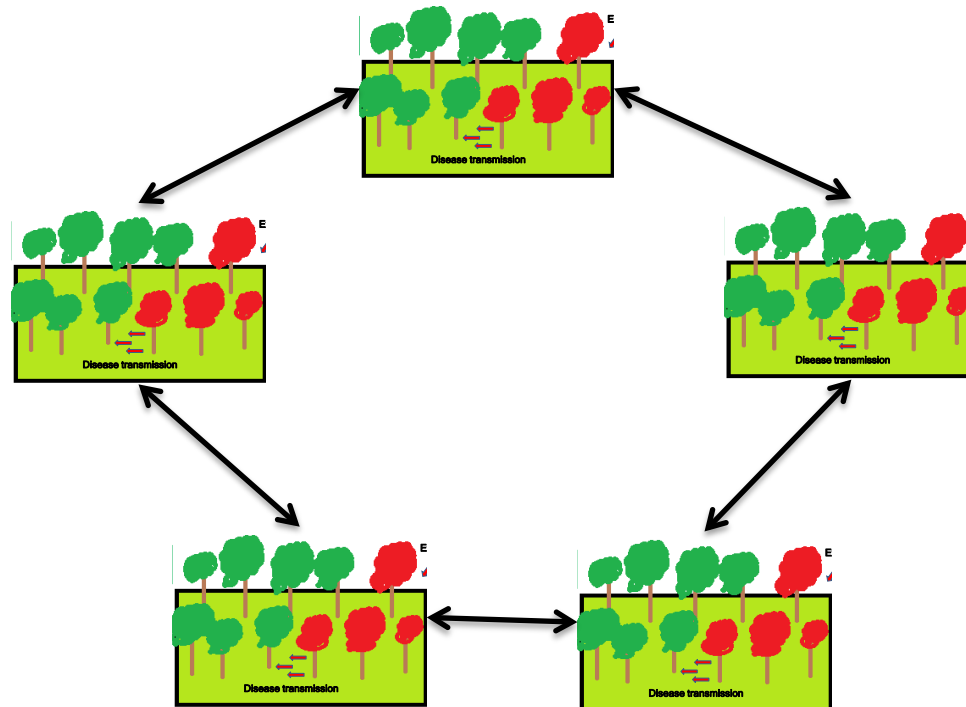
- Far from disease focus:
- if damage low, do nothing or apply treatment if available
- if damage high, apply some level of prevention



- Extensions:
  - Combination of prevention and treatment is not optimal in this model
  - Extension of the model to optimise with respect to both prevention and treatment

# Model 2: Control on landscape

- **How does the efficacy of control depend on decision-making of individual owners?**
- Decisions under limited knowledge
- Decision of one owner impacts on the situation of others
- Single rotation; growing forest



# Model 2: Control on landscape

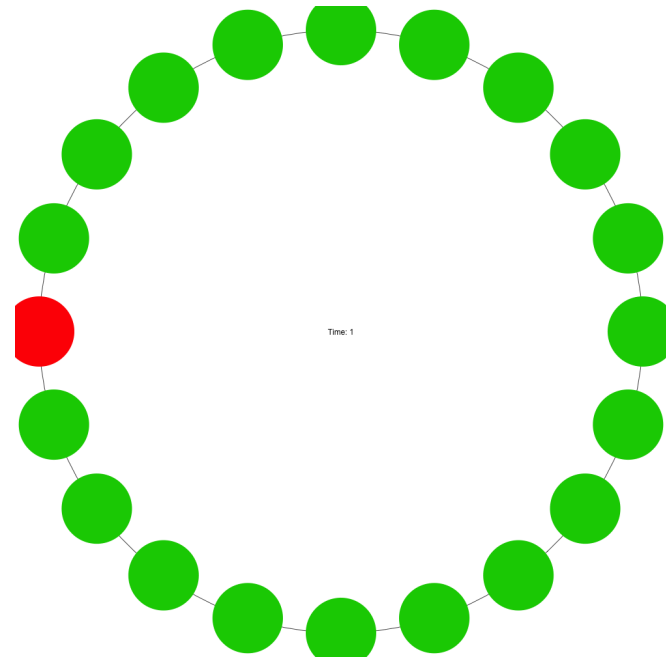
## Agent-based model

- Tree growth:  $V(t) = \left(1 - e^{-0.0342t}\right)^3$
- Agents located on a 1-dim network
- Decision taken every year:
  - keep forest
  - clear fell
- Disease reduces profit at felling

- Susceptible stays susceptible  $\Delta V_{SS} = e^{-d}V(t+1) - V(t)$
- Susceptible becomes infected  $\Delta V_{SI} = e^{-d}\rho V(t+1) - V(t)$
- Infected stays infected  $\Delta V_{II} = e^{-d}\rho V(t+1) - \rho V(t)$

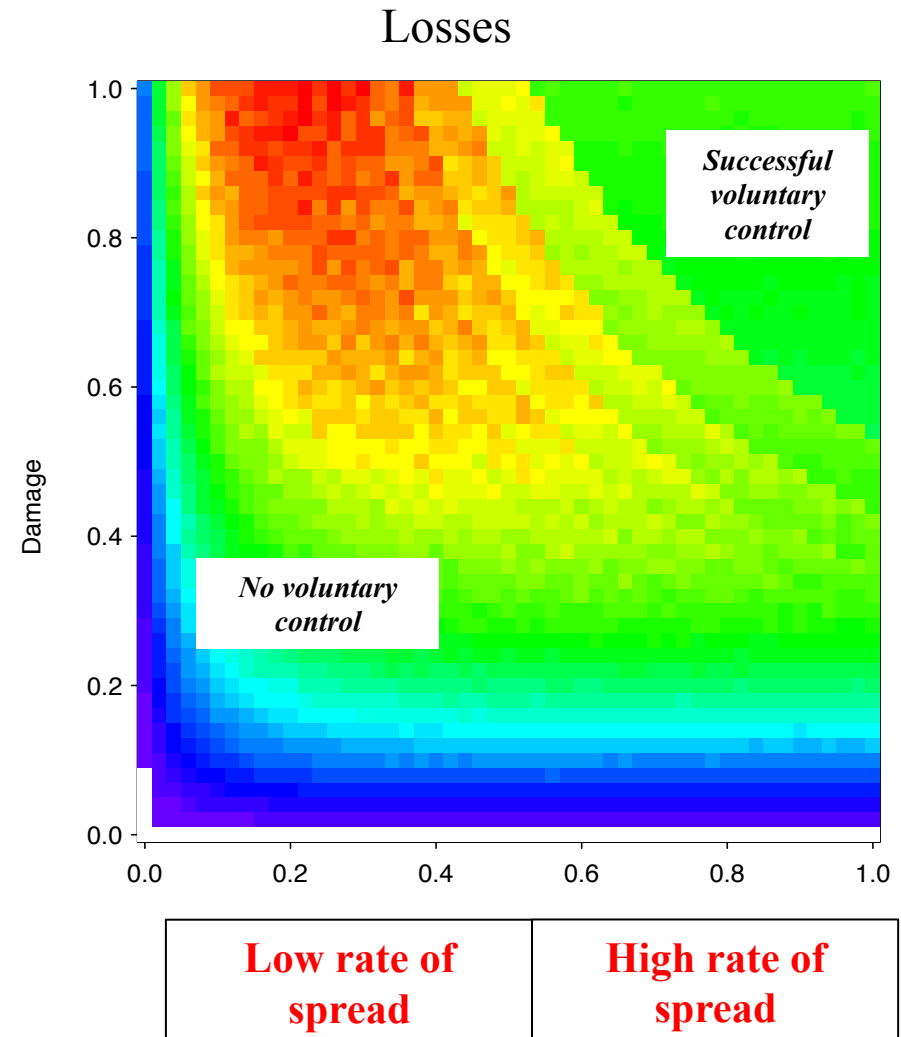
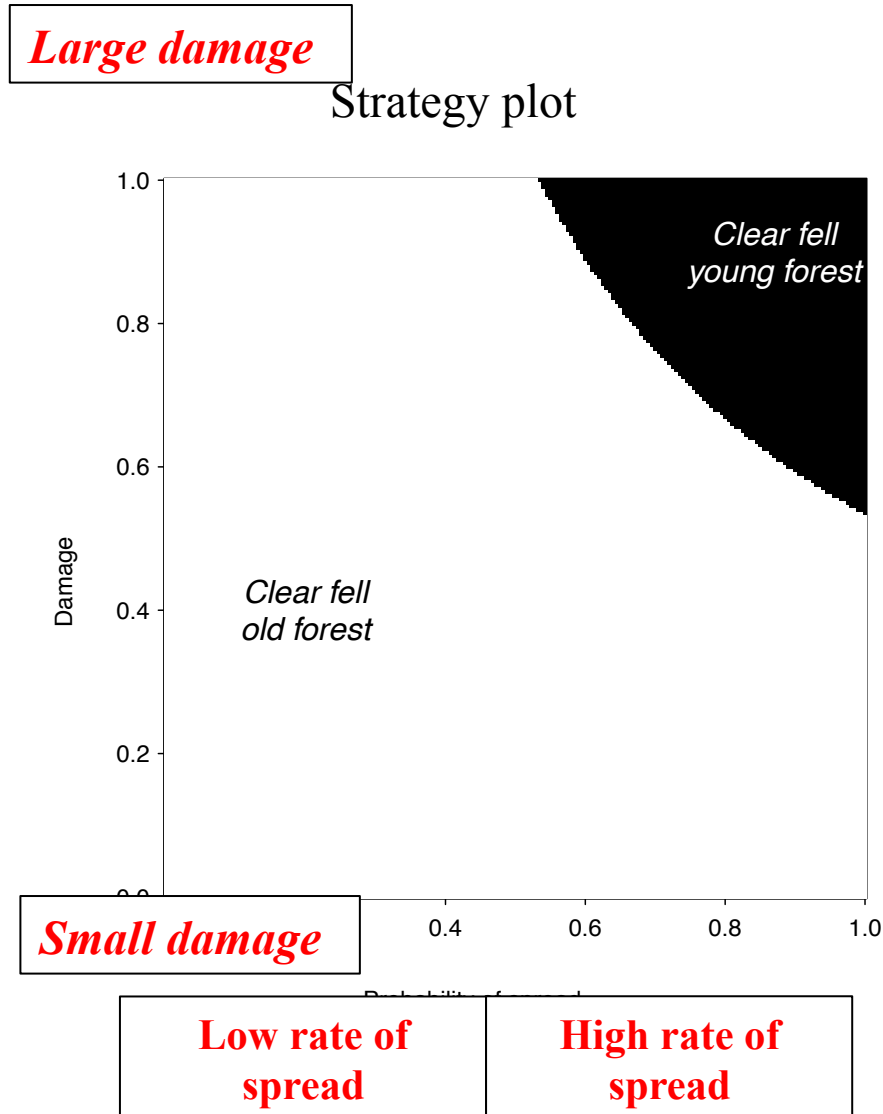
- Infection spreads with probability  $p$  to nearest neighbours
- Decision to keep/clear fell based on expected profit

$$\Delta V = (1 - p)^{\#inf} \Delta V_{SS} + \left(1 - (1 - p)^{\#inf}\right) \Delta V_{SI}$$



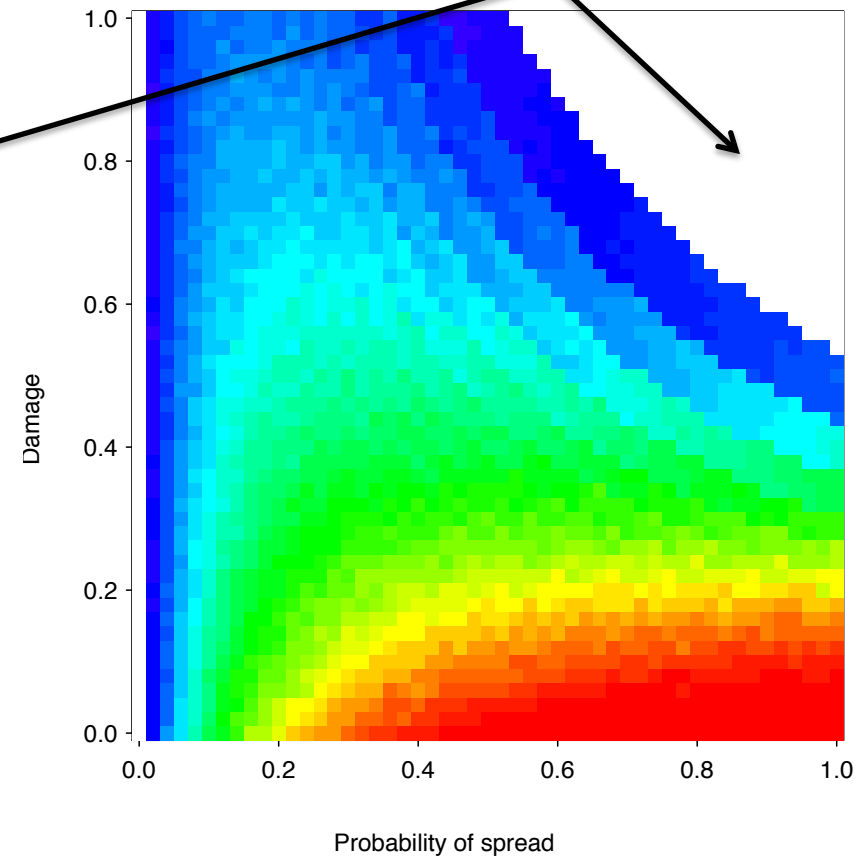
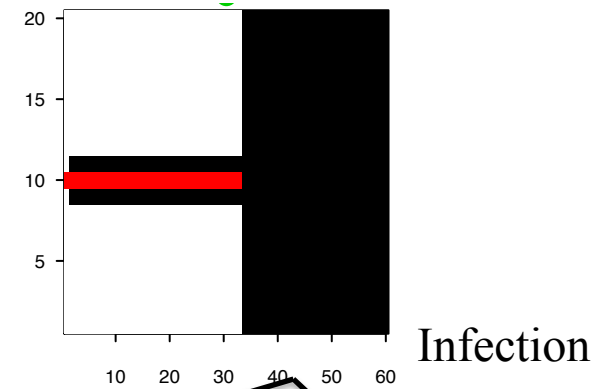
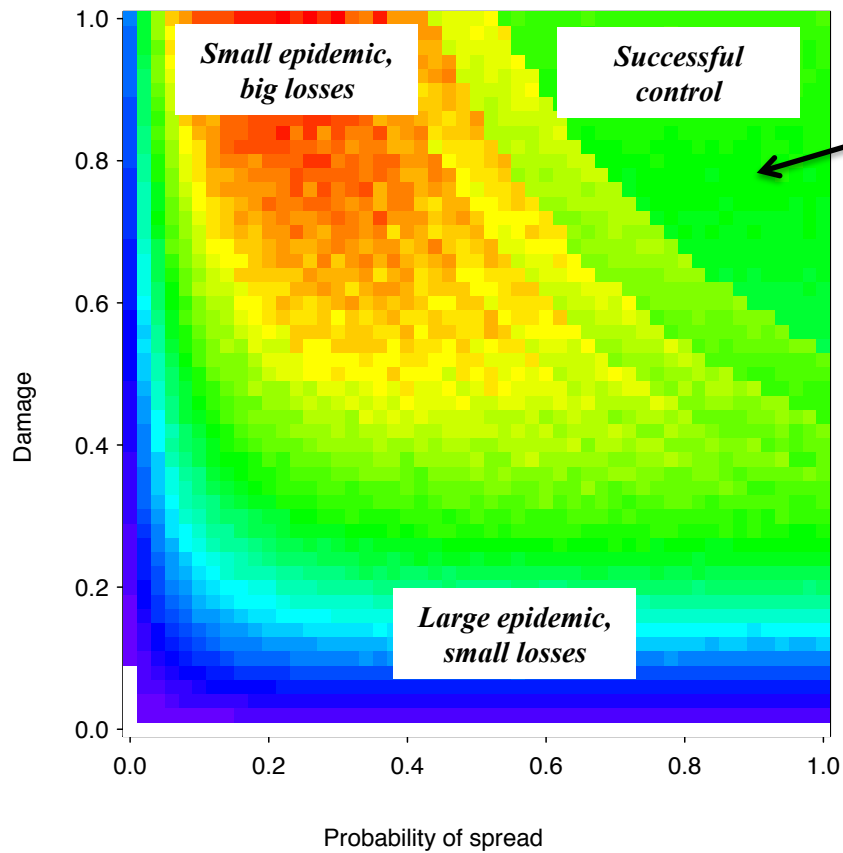
# Model 2: Control on landscape

- $N=50$
- 51 by 51 parameter sets
- 100 simulations for each set
- Final time  $t=40$

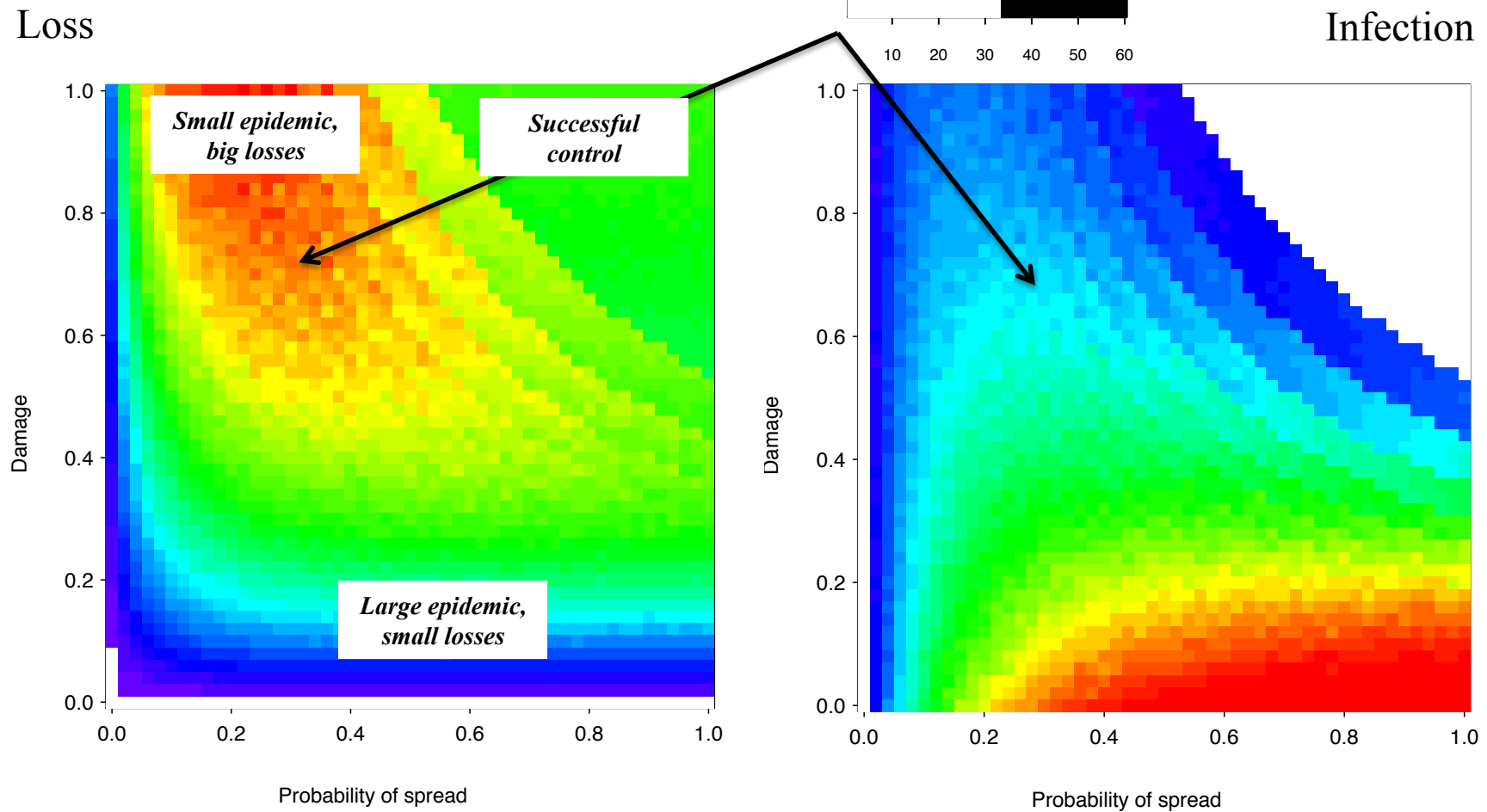


# Model 2: Voluntary control

Loss

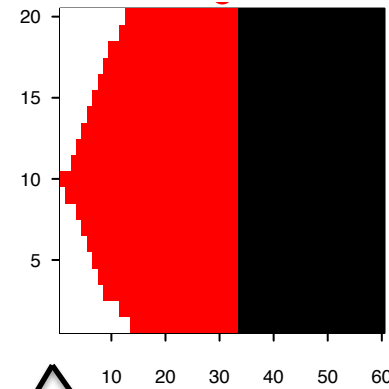
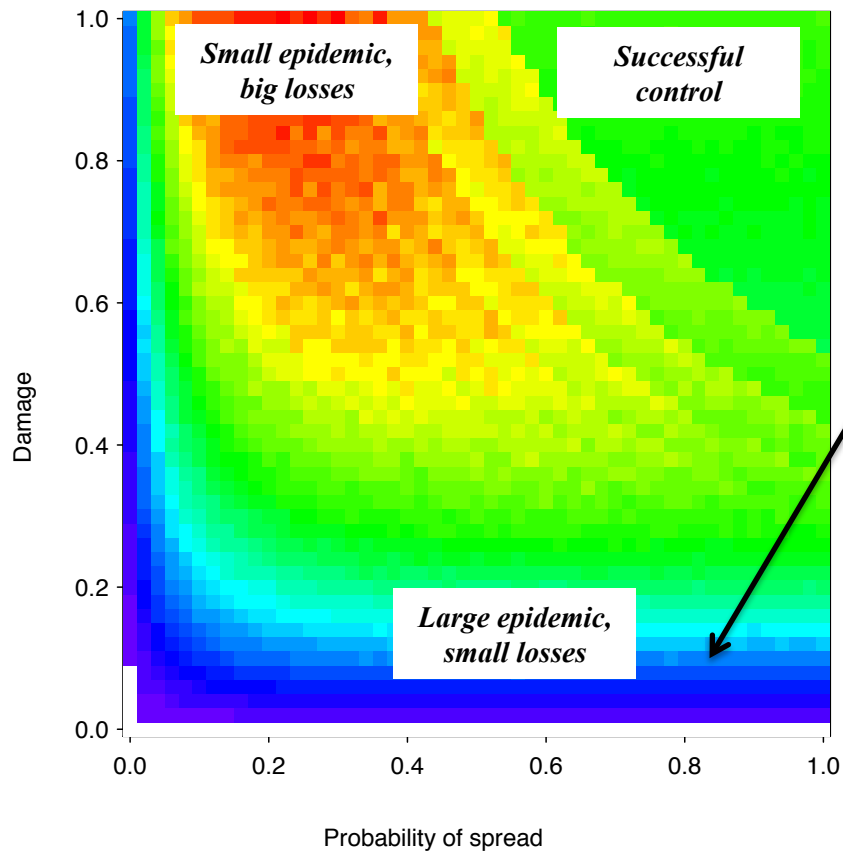


# Model 2: High loss failure

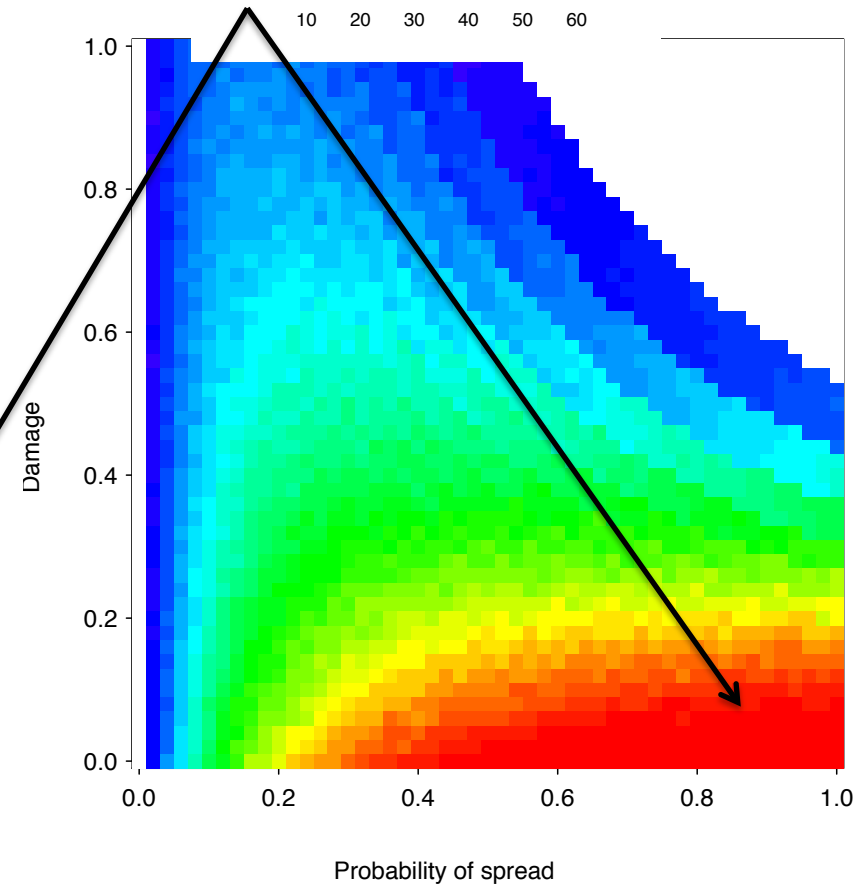


# Model 2: High infection failure

Loss



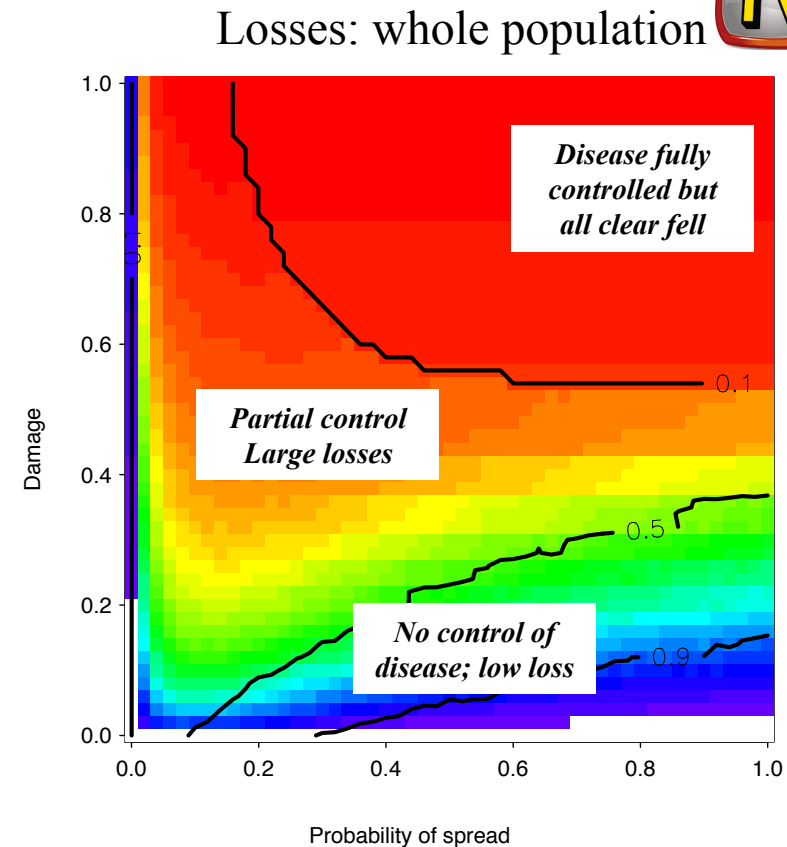
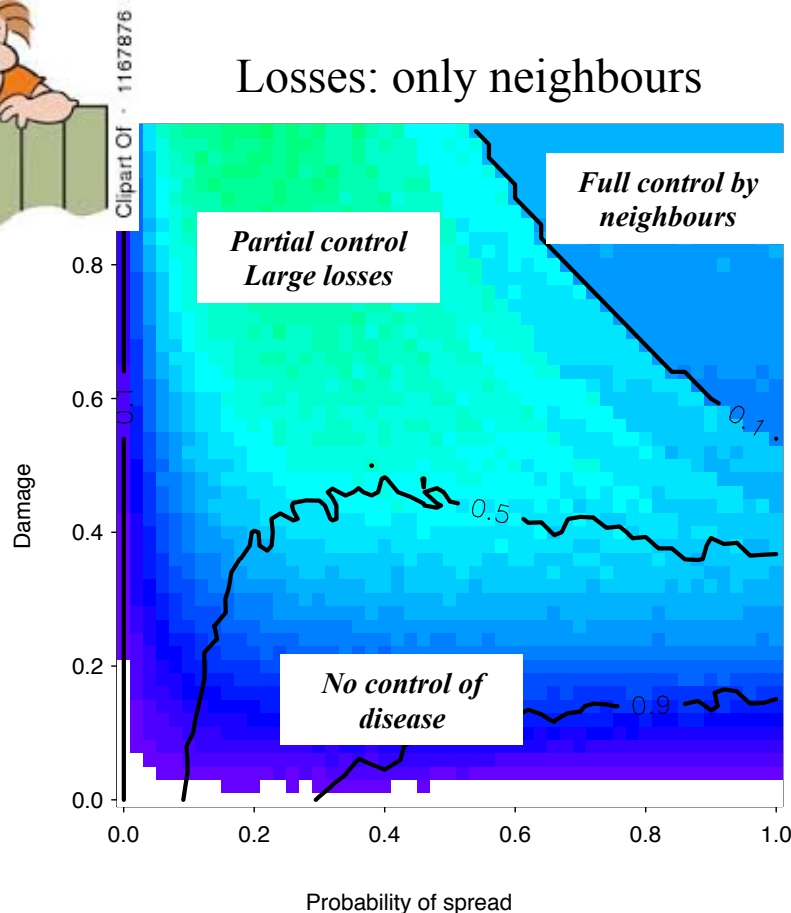
Infection





# Model 2: Neighbourhood

- Decision under uncertainty
- Spread is local, but decisions can be based on all sites or on neighbourhood
  - Matching scales is important
- Note same colour scale for losses



# Model 2: Summary

- Three regions:
  - Successful voluntary control (low rate, high damage)
  - Large outbreak (high rate, low damage)
  - Moderate outbreak with high losses (medium rate, high damage)
- Timing is important (forest either young or close to maturity)
- Knowledge and scale are keys to control
  - Too much leads to panic and overreaction
  - Too little leads to under response
- Extensions:
  - Realistic network
  - Realistic decision making process
  - Trade-off between immediate and long-term risk/profit
  - Subsidies
  - Game theoretical approach

# Conclusions

- Most epidemics originate from economic decisions and result in economic losses
- Modelling provides a tool to link economic decisions to epidemiology and to forest management
- Trade-offs:
  - Control now to prevent potential disease outbreak in the future
  - Control costs vs costs of disease spread
  - Affected by perception of risk and information
- Questions:
  - Are people (managers, politicians, public) aware of the trade-offs?
  - How do we communicate these trade-offs?
  - How do people resolve these trade-offs?
  - How do people resolve uncertainties?

Thanks to collaborators and funders:

<http://www.forestresilience.net/>

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