

Criteria for epidemic outbreaks---objective eradication of infection

$$R_0 > 1$$

$$R_0 \leq 1$$

Not necessary for mitigation: behavioral and economic objectives:  
is it possible a similar guideline?

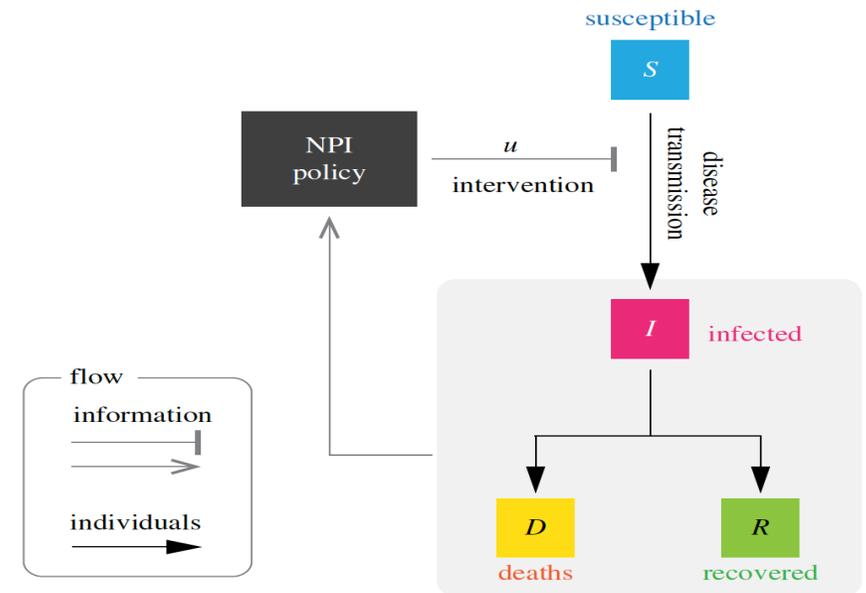
$$S' = -\beta(1 - u)SI,$$

$$I' = \beta(1 - u)SI - \gamma I,$$

$$R' = \gamma I$$

Modeling non-pharmaceutical interventions (NPI)

(a)



Optimal NPI must:

minimize application period (economic, societal costs)

maximum (desired) prevalence must not be exceeded (public health)

Optimal strategy depends on the state of system

Reproduction number below 1, sufficient but not necessary.

Depends on maximum desired prevalence ( $I_{max}$ ).

Intervention must start before  $I_{max}$  is reached (not seeking  $R_0 < 1$ ).

$$(S, I) \in [0, 1]^2 \quad 1 - u, u_{max}$$

reduction on effective contact rate

$$I(t) \leq I_{max} \quad u, u_{max} \in [0, 1], u \in [0, u_{max}]$$

is an **admissible** control

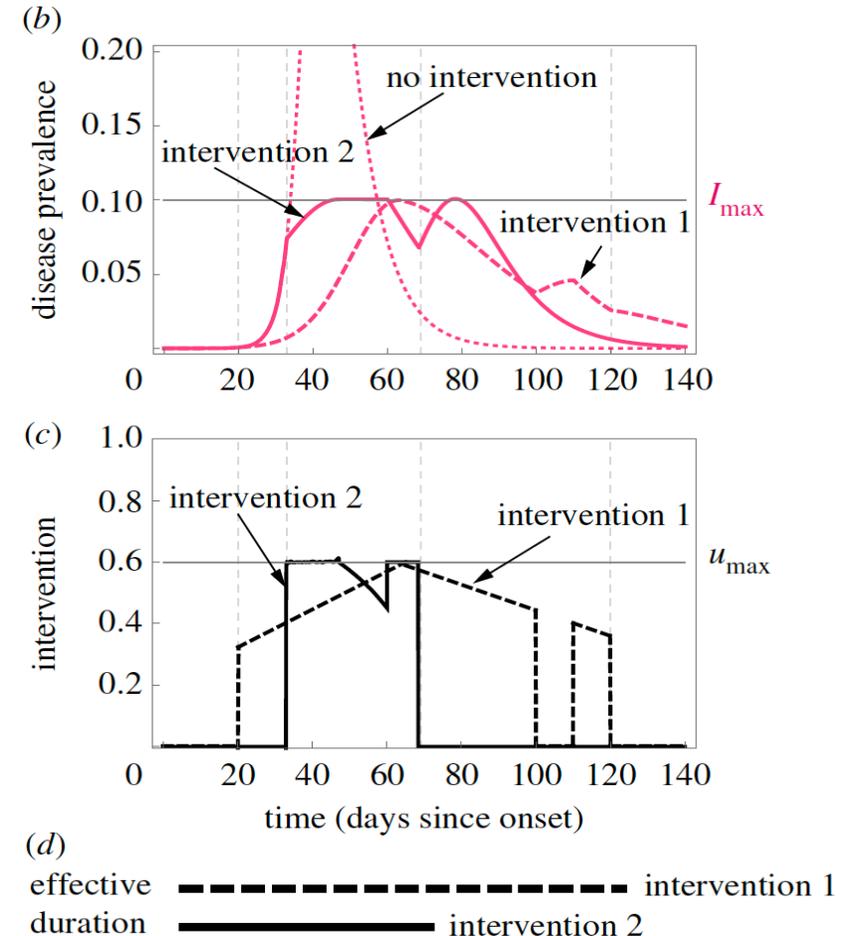
Optimal admissible is  $u^*(S(t), I(t))$  required at time  $t$  (**now**) to:

**Optimal depends on state of system**

minimize intervention period.

maximum (desired) prevalence is not exceeded in future

Aim is **mitigation**



Safe zone  $\Delta$ : largest set in state space such that for any given time  $t_1$   $(S(t_1), I(t_1)) \in \Delta$ , we can put  $u = 0$ , and still have  $I(t) \leq I_{max}$  for all  $t \geq t_1$

$$\Delta = \{(S, I) : I \leq \Phi_{R_0}(S)\}$$

$$\Phi_R(S) = \begin{cases} I_{max}, & \text{for } S \leq \frac{1}{R} \\ I_{max} + \frac{1}{R} (\log RS + 1 - RS), & \text{otherwise.} \end{cases}$$

**Want:** to steer  $(S_0, I_0)$  into  $\Delta$  in minimal time keeping  $I \leq I_{max}$

An optimal intervention exists if and only if  $(S_0, I_0)$  satisfies  $I_0 \leq \Phi_{R_c}(S_0)$ .

$$u^*(S, I) = \begin{cases} 0, & \text{for } (S, I) \in \Delta \cup W \\ 1 - \frac{1}{R_c S}, & \text{for } I = \Phi_{R_c}(S) \text{ and } S^* < S < R_c^{-1}, \\ u_{max}, & \text{otherwise.} \end{cases}$$

**Controlled reproduction number**

$$R_c = (1 - u_{max})R_0$$

$R_c < 1$ , eradication

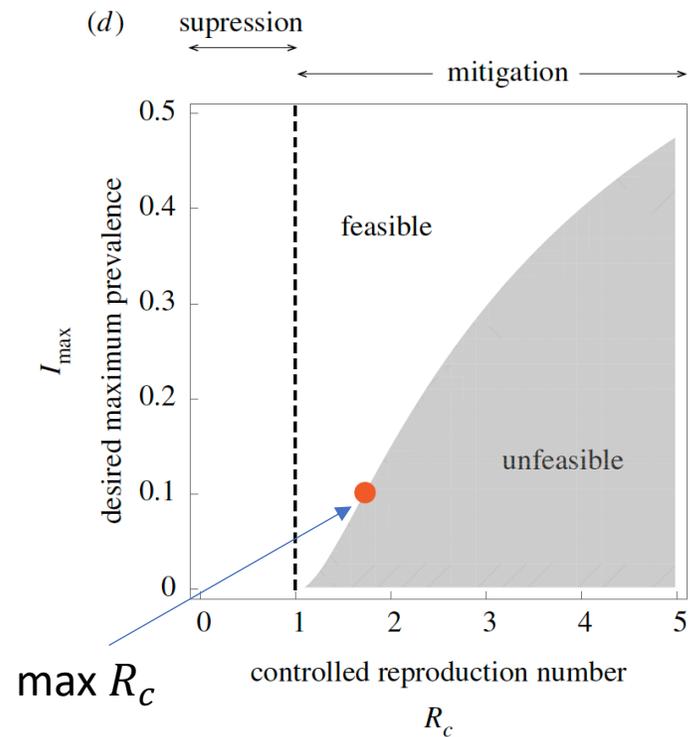
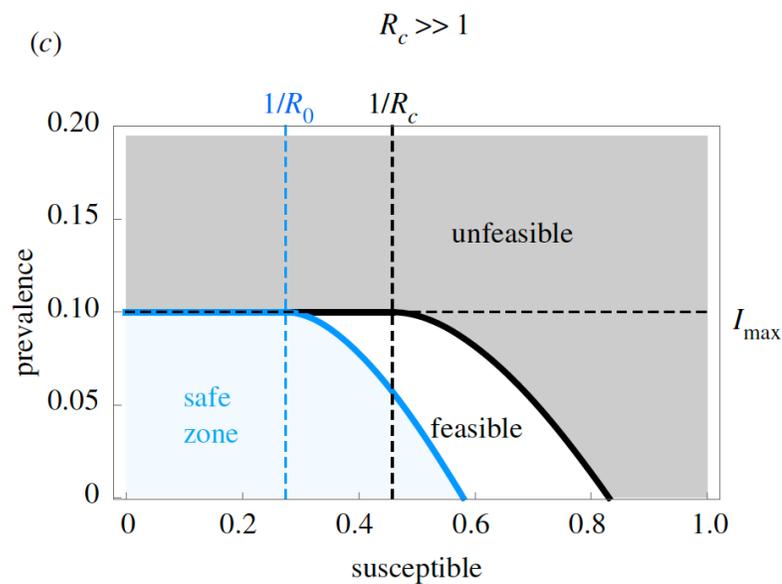
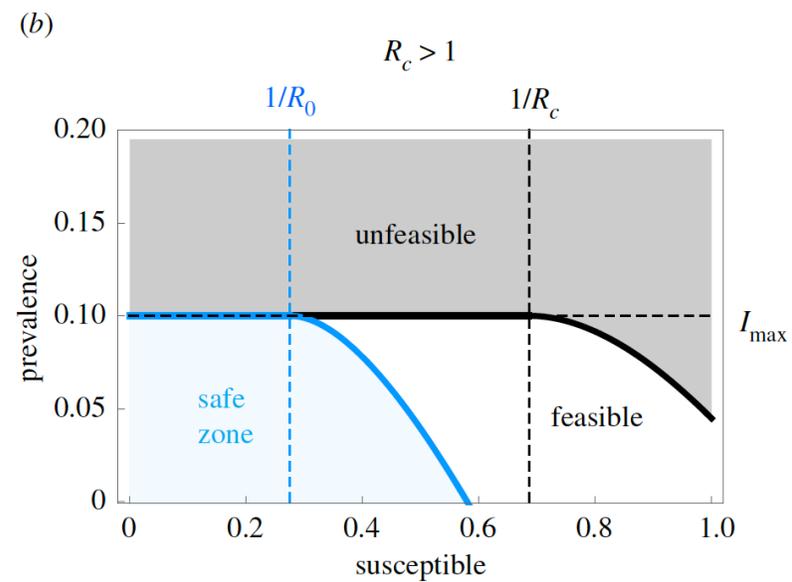
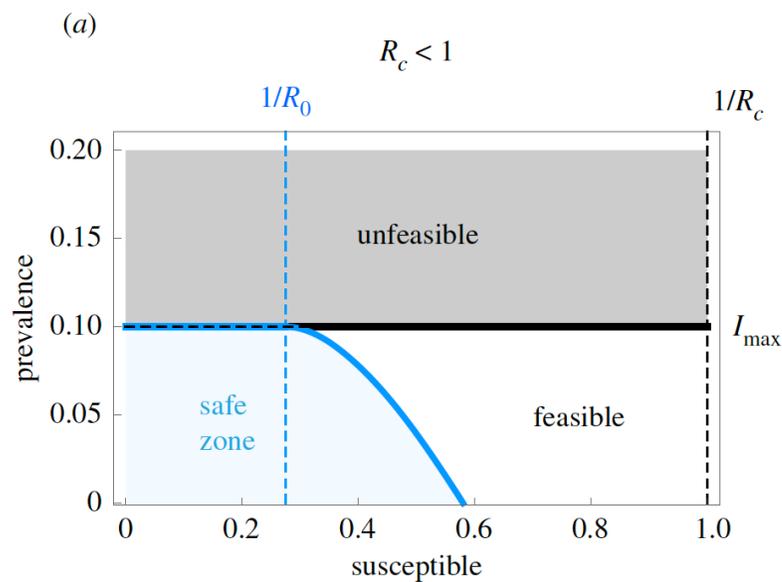
$R_c > 1$ , mitigation still feasible

Maximum reduction that *admissible* interventions can achieve

For  $S_0 \rightarrow 1$ , NPI exist,  $I(t) < I_{max}$ :

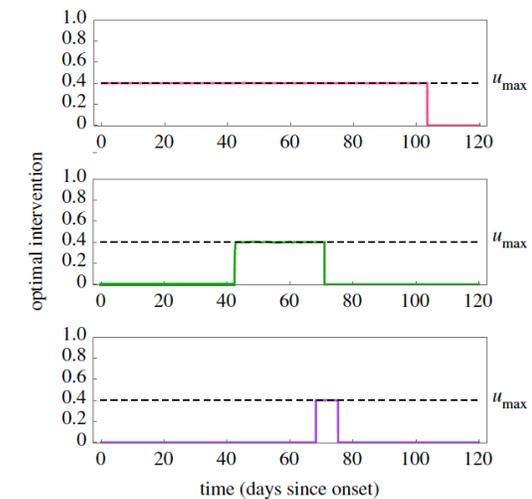
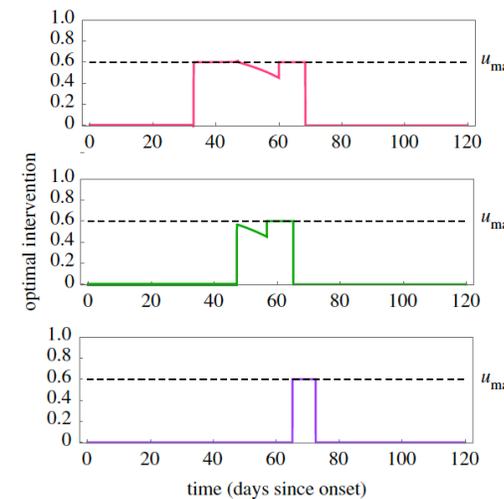
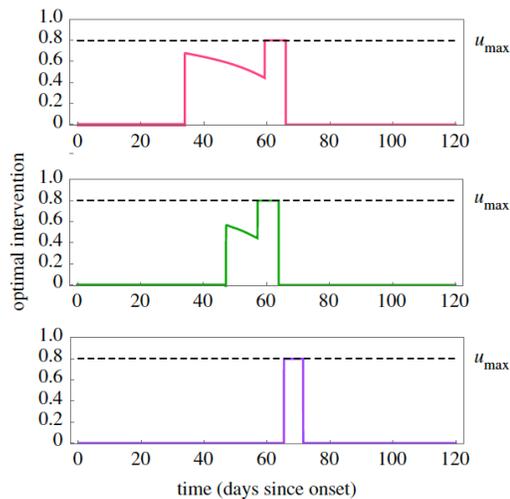
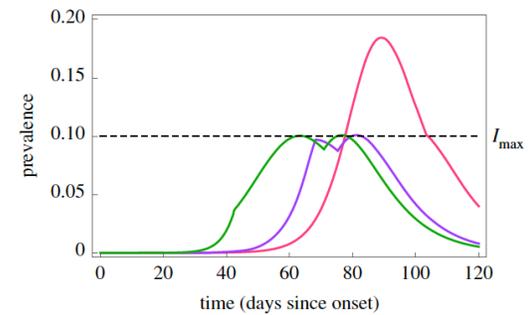
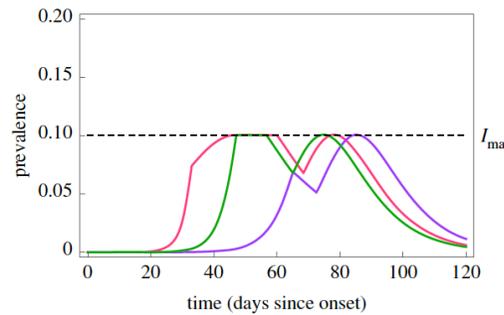
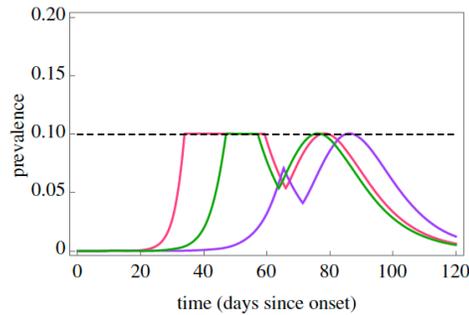
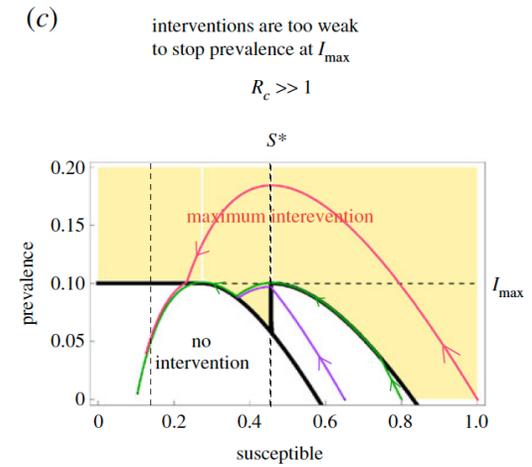
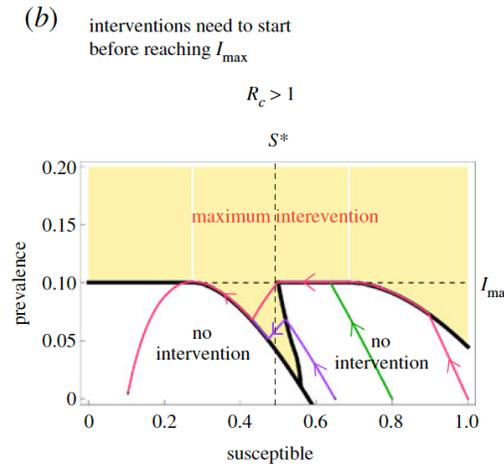
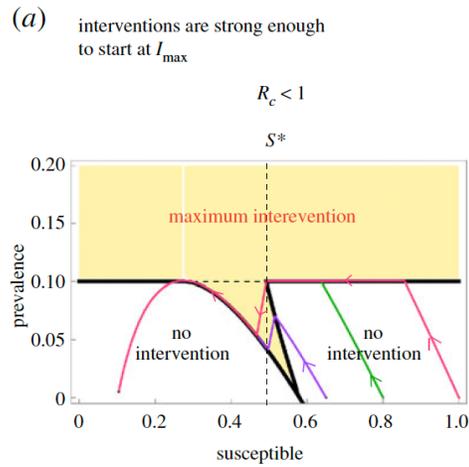
$R_c < 1$  or

$$I_{max} + \frac{1}{R_c} \log R_c - \left(1 - \frac{1}{R_c}\right) \geq 0$$



Scenarios:

- Interventions until  $I_{max}$  is reached
- Early interventions
- Ineffective interventions



In general (case  $R_c > 1$ ):

- no intervention
- maximum strength interventions
- gradual decrease of interventions
- maximum intervention to safe zone

# Behaviour and infectious diseases

- Human behavior underutilized in epidemiology before CoVID
  - Data scarcity
  - Underdeveloped computational technologies.
  - Behavioral dynamics during pandemic
    - Social distancing.
    - Mask wearing.
    - Vaccine hesitancy.
  - Research and data for models and simulations.
  - Need: computational models, artificial intelligence and machine learning techniques that bridge human behavior knowledge and traditional epidemiological theory and models.
- Role of heterogeneity
  - Static unweighted networks
  - Weighted dynamic networks
  - Waning immunity on network models
  - Approximation of epidemic processes on networks
  - Effect of network properties
  - Networks and data
  - Design network-based interventions



Epidemics  
Volume 10, March 2015, Pages iii-iv



Challenges in Modelling Infectious Disease  
Dynamics: Preface

