

# Cooperation in Social Dilemmas

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***Sanctioning institutions for governing the commons***



# Public goods games

## *Games and population dynamics*

- Large population, players interact in randomly formed groups of size  $N$ .
- Two strategic types
  - cooperators  $x$  - contribute to common pool at cost  $c$ .
  - defectors  $y$  - contribute nothing
- Total contributions are multiplied by  $r > 1$  and equally split among all *other* participants (irrespective of their type):

$$P_y = \frac{rc}{N-1} x(N-1) = rc x$$

$x$ : frequency of cooperators

$$P_x = P_y - c = (rx - 1)c$$

- Payoffs translate into reproductive fitness.

$$\begin{aligned}\dot{x} &= x(P_x - \bar{P}) \\ &= x(1-x)(P_x - P_y)\end{aligned}$$

✚ Cooperators go extinct.



# Punishment

## *Promoting cooperation - part I*

- Punishment is costly - punisher pays  $\gamma$ , punishment fine  $\beta$ .
- Three strategic types
  - cooperators  $x$                       - contribute to public goods, do not punish
  - defectors  $y$                          - do not contribute, do not punish
  - peer punishers  $w$                  - contribute and punish those that did not

## ■ Payoffs

$$\begin{aligned}
 P_x &= B - c \\
 P_y &= B - (N-1)w - \beta \\
 P_w &= B - c - (N-1)y - \gamma
 \end{aligned}$$

$\underbrace{\hspace{10em}}$   
 public goods

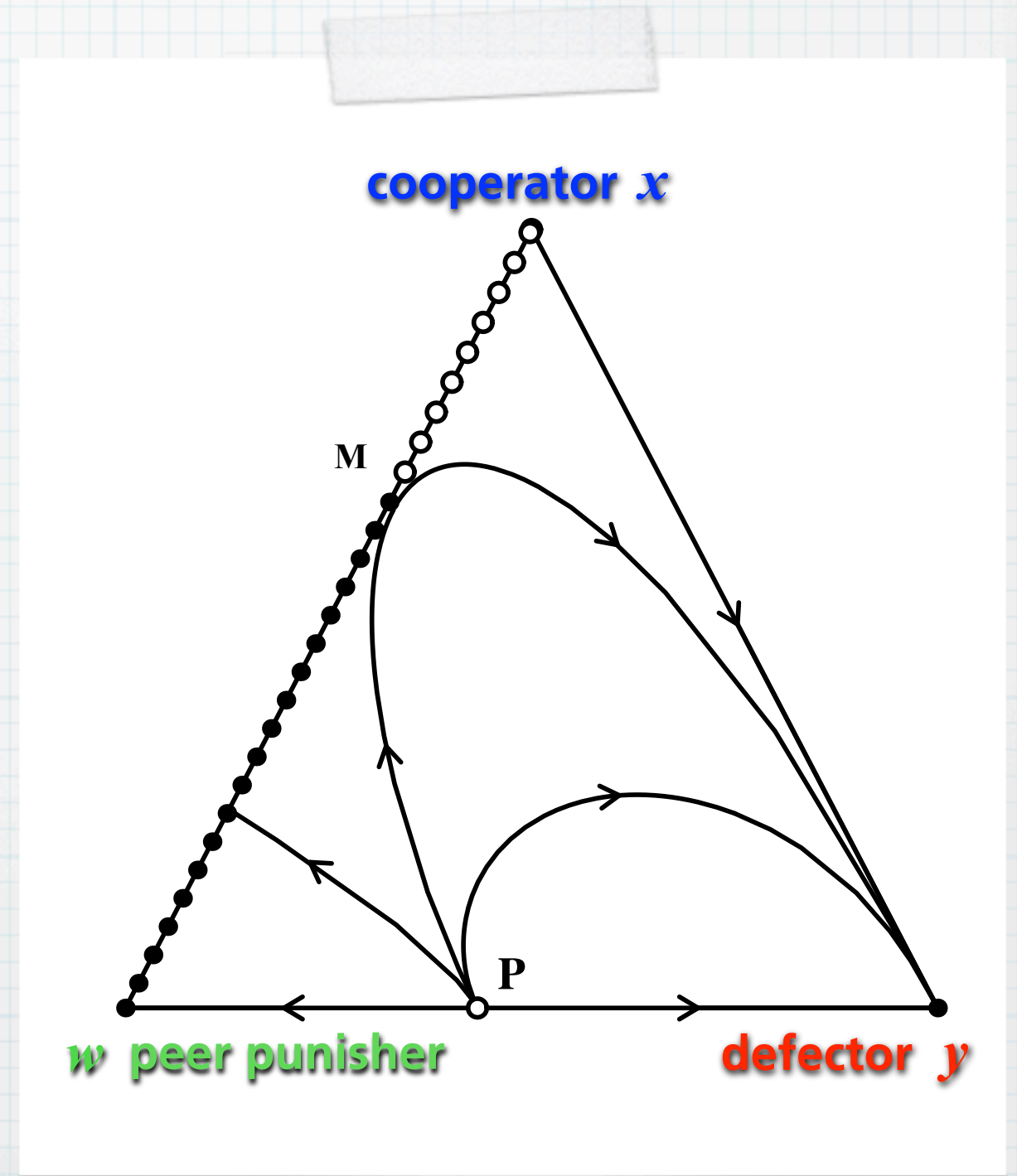
$\underbrace{\hspace{10em}}$   
 punishment

$$B = rc(x + w) \quad \text{benefits from public good}$$

# Punishment

## *Effects of punishment*

- Defection is the only stable state.
- No selection in populations of cooperators and peer punishers (line of fixed points).
- ↪ Cooperators pave the way for defectors.
- ↪ How can punishment gain a foothold in the population?



*Sigmund, Hauert & Nowak (2001) PNAS 98 10757.*



# Volunteering

## *Promoting cooperation - part II*

- Participation in public goods interactions is voluntary.
  - Joint effort is risky - potential for high costs and large benefits.
  - Risk averse individuals obtain small but fixed payoff  $\sigma$   
( $0 < \sigma < (r - 1)c$ , better than mutual defection but worse than mutual cooperation).
  - Three strategic types
    - cooperators  $x$  - contribute to public goods
    - defectors  $y$  - do not contribute
    - loners  $z$  - refuse to participate
- ⇒ Single participant receives  $\sigma$ .



collective hunt



raiding

# Volunteering

## Theory

### ■ Payoffs

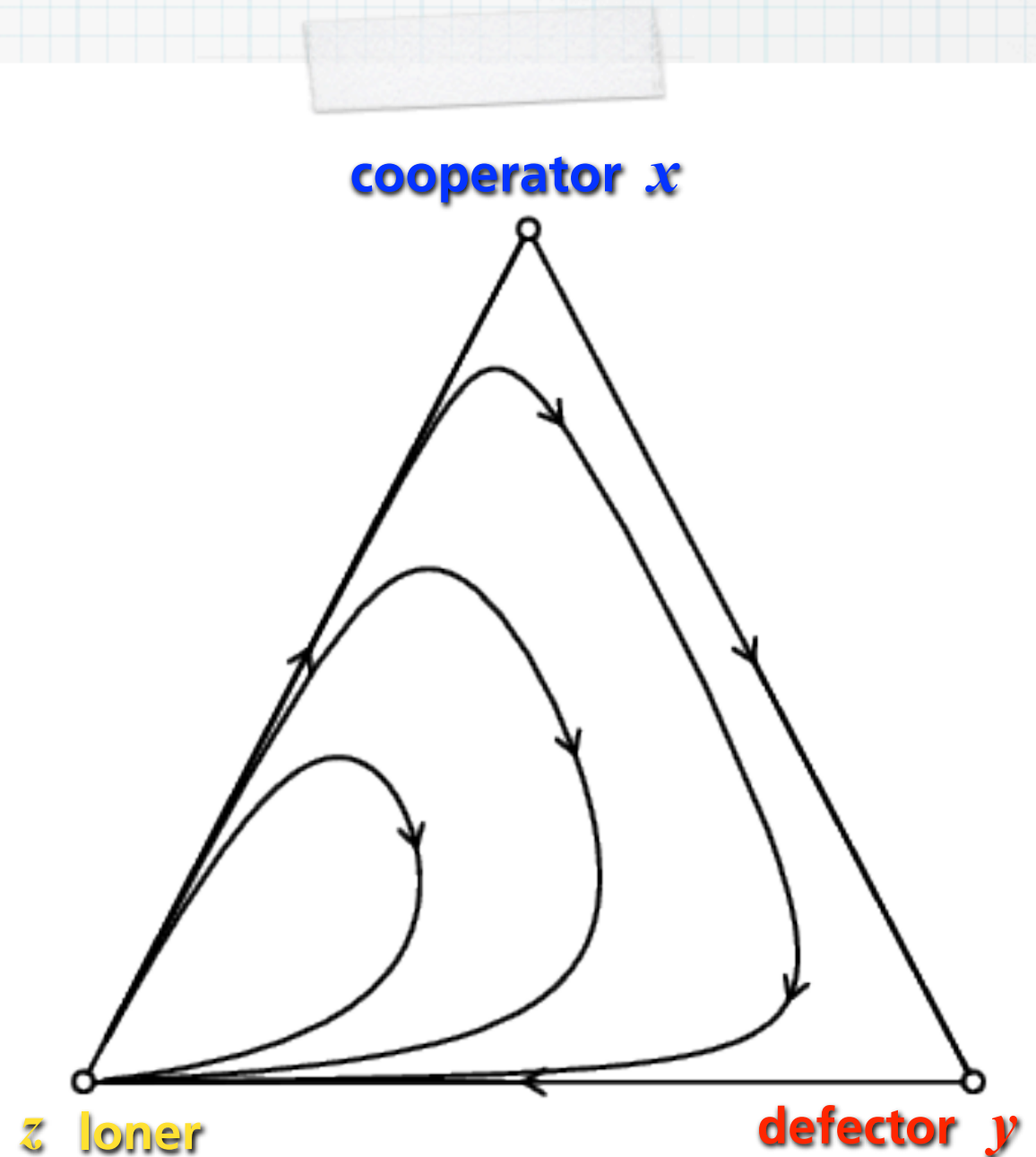
$$P_y = \sigma z^{N-1} + (1 - z^{N-1})rc \frac{x}{1-z}$$

$$P_x = P_y - (1 - z^{N-1})c$$

$$P_z = \sigma$$

- ↪ Rock-Scissors-Paper type cyclic dominance along boundary of  $S_3$ .
- ↪ Loners provide an escape hatch out of states of mutual defection - but this is a fleeting state.

Hauert, De Monte, Hofbauer & Sigmund (2002)  
*Science* **296** 1129.





# Volunteering & Punishment

## *Promoting cooperation - part III*

### ■ Four strategic types

- cooperators  $x$                       - contribute to public goods, do not punish
- defectors  $y$                          - participate but do not contribute, do not punish
- loners  $z$                              - do not participate
- peer punishers  $w$                  - contribute and punish

⇒ Allow for second order punishment - punish those that failed to punish  
( $\alpha$  controls strength).

### ■ Payoffs

$$\begin{aligned}
 P_x &= P'_x - \alpha\beta w(N-1)(1 - (1-y)^{N-2}) \\
 P_y &= P'_y - \beta w(N-1) \\
 P_z &= \sigma \\
 P_w &= P'_x - \alpha\gamma x(N-1)(1 - (1-y)^{N-2}) \\
 &\quad - \gamma y(N-1)
 \end{aligned}$$

$\underbrace{\hspace{10em}}$   
 voluntary  
public goods

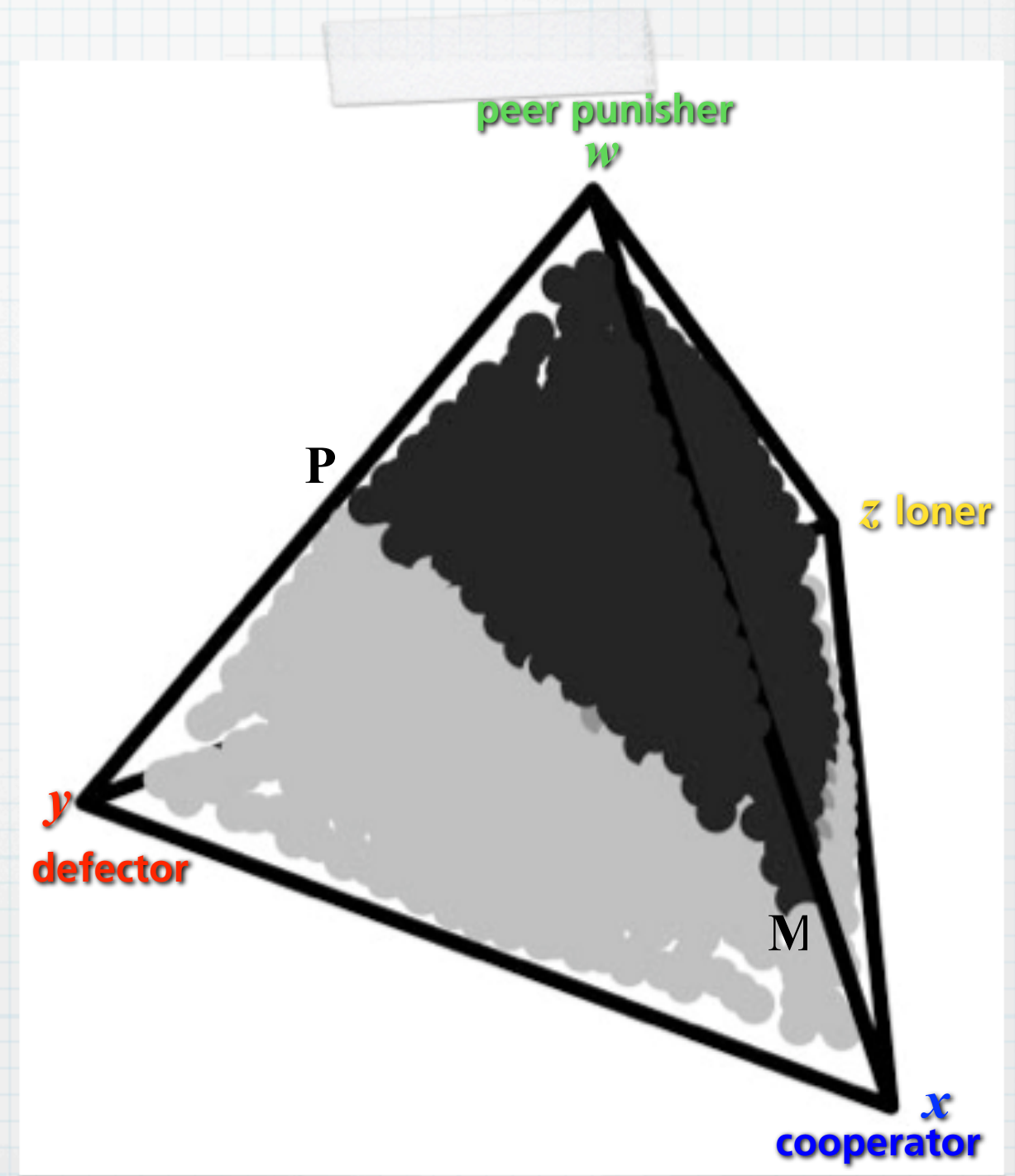
$\underbrace{\hspace{20em}}$   
 punishment

# Volunteering & Punishment

## *Population dynamics*

- Replicator dynamics exhibits two basins of attraction:
  - neutral mixtures of punishers and cooperators (line of fixed points).
  - loners only.
- ✚ Fails to explain the evolution of punishment.
- ✚ Second order punishment barely affects the dynamics.
- ✚ Degenerate dynamics - long term outcome unclear.
- ✚ Stochastic model.

*Brandt, Hauert, Sigmund (2006)  
PNAS 103 495.*





# Finite Populations

## *Genetic reproduction or social imitation*

### ■ Interaction:

- Random sampling of interaction group without replacement.

### ■ Evolution:

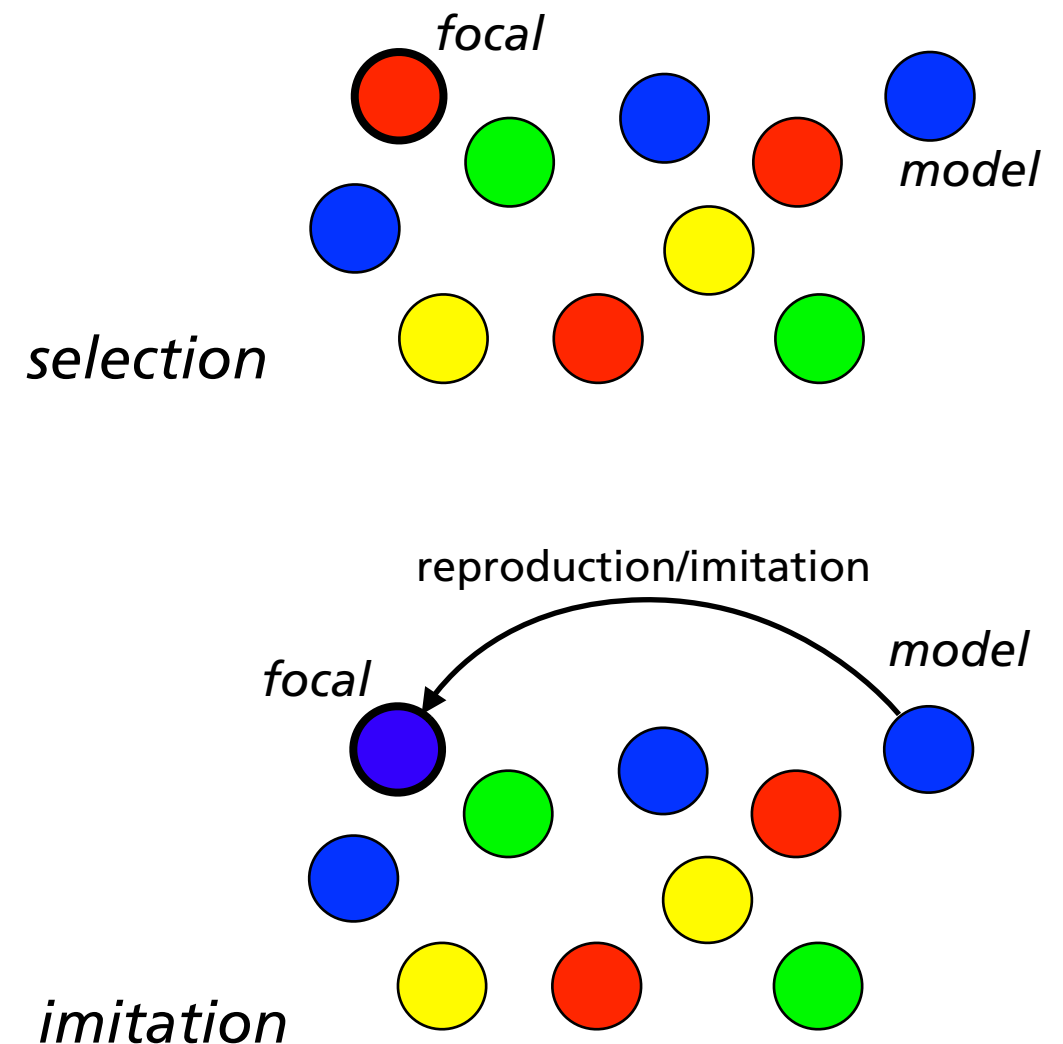
- Randomly choose focal individual  $i$ .
- Randomly choose model individual  $j$ .
- Focal individual adopts strategy of model with probability proportional to payoff difference  $P_j - P_i$ :

$$\frac{1}{1 + \exp[-s(P_j - P_i)]}$$

$s \geq 0$ : strength of selection

⇒  $s \rightarrow 0$ : random selection

⇒  $s \rightarrow +\infty$ : deterministic selection



# Finite populations

## *Stochastic dynamics*

### ■ Rare mutations $\mu$ :

- population is homogeneous most of the time.
- occasionally a single mutant strategy occurs.
- mutant disappears or takes over the entire population before next mutation occurs.

⇒ Stochastic dynamics along edges of simplex  $S_n$ .

### ■ Probability that type $i$ increases competing against type $j$ , $T_{ij}^+$ :

$$T_{ij}^+ = \frac{X_i}{M} \frac{M - X_i}{M} \frac{1}{1 + \exp[-s(P_i - P_j)]}$$

$M$ : population size,  $X_i$ : number of type  $i$  individuals,  $M - X_i$ : number of  $j$  types.

### ■ Fixation probability of single $i$ mutant in $j$ population.

$$\rho_{ij} = \frac{1}{\sum_{k=0}^{M-1} \prod_{X_i=1}^k \frac{T_{ij}^-}{T_{ij}^+}} = \frac{1}{\sum_{k=0}^{M-1} \exp \left[ s \sum_{X_i=1}^k (P_j - P_i) \right]}$$

⇒ Embedded Markov chain for transitions between homogenous states.



# Finite populations

## *Strong imitation* $s \rightarrow \infty$

- Strong imitation significantly simplifies Markov chain.

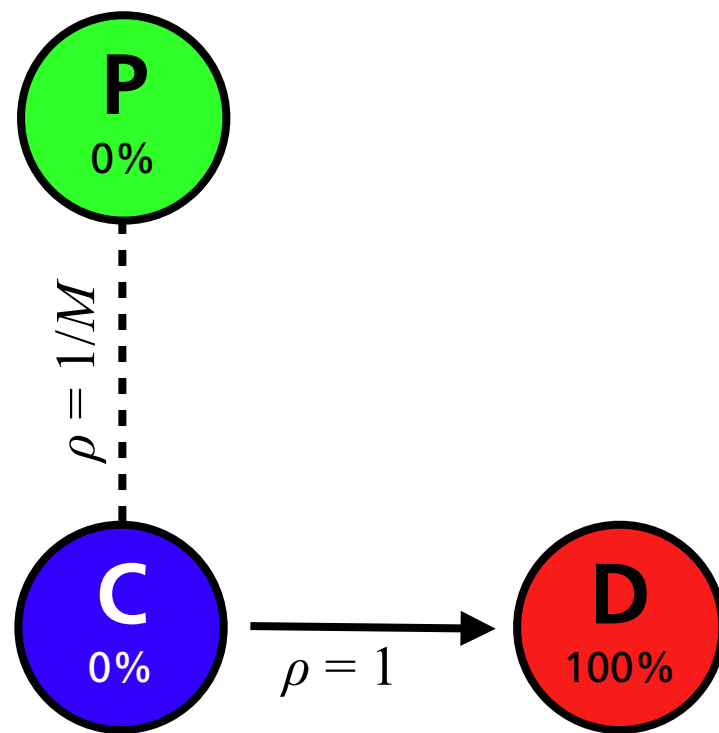
Ex. voluntary public goods games:  $\rho_{XY} = \rho_{YZ} = 1$  and  $\rho_{ZX} = 1/2$  all other  $\rho_{ij} = 0$ .

$$\begin{pmatrix} \frac{1}{2} & \frac{1}{2} & 0 \\ 0 & \frac{1}{2} & \frac{1}{2} \\ \frac{1}{4} & 0 & \frac{3}{4} \end{pmatrix} \rightarrow \left( \frac{1}{4}, \frac{1}{4}, \frac{1}{2} \right)$$

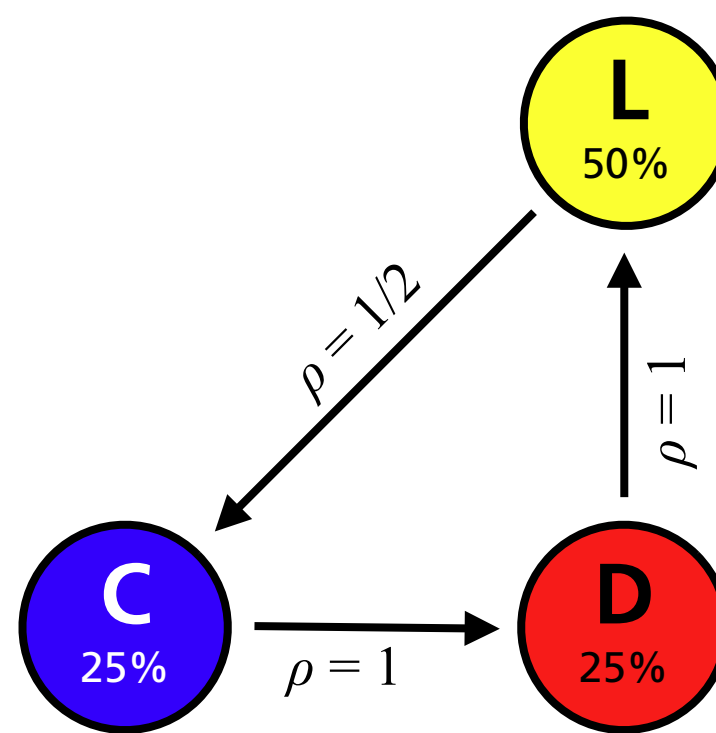
- ✚ The result becomes independent of the parameters! (as long as the cyclic dominance  $X \rightarrow Y \rightarrow Z \rightarrow X$  persists).
- ✚  $\rho_{ZX} = 1/2$  because two cooperators are required to invade a loner population (non-hyperbolic fixed point in replicator equation).
- ✚ Neutral evolution (no fitness differences) yields fixation probability of  $1/M$  where  $M$  denotes the population size.

# Volunteering & Punishment

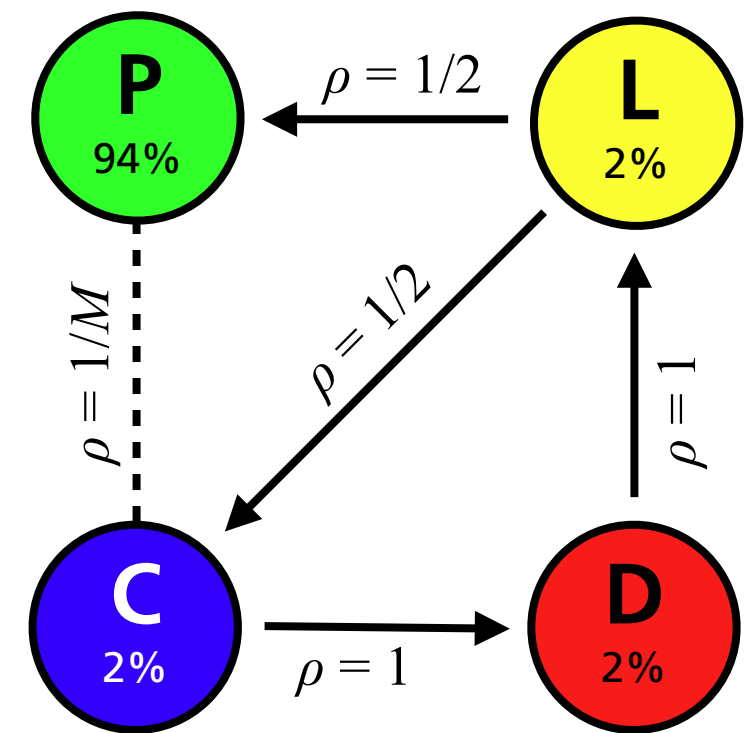
## Results



Compulsory public goods games with peer punishment: defectors rule.



Voluntary public goods games: cyclic dominance.



Voluntary public goods games with peer punishment: punishers reign ( $M=92$ ).

Hauert, Traulsen, Brandt, Nowak & Sigmund (2007) *Science* **316** 1905.

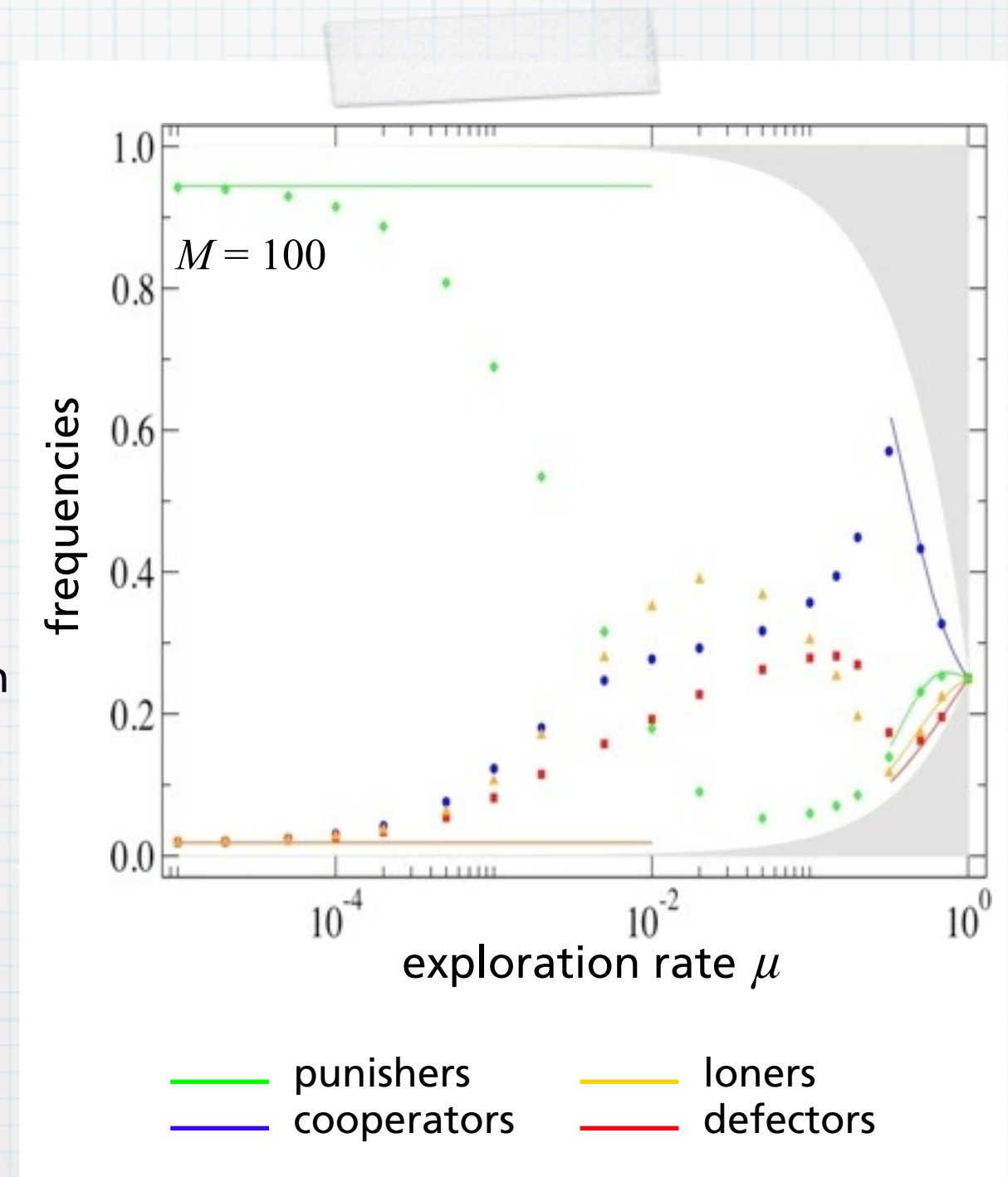


# Cultural Evolution

## *Population dynamics*

- In cultural evolution 'mutation' rates may not be small - individuals randomly experiment with different strategies.
- For smaller  $\mu$ , punishment prevails.
- ⇒ The stochastic dynamics in finite populations can resolve the problem of establishing altruistic punishment
- Cooperators prevail for large  $\mu$ .  
(Note that here the contributors also get a return on their own investment - otherwise loners dominate.)
- ⇒ Loners are no longer crucial.
- ⇒ Punishers are pivotal for the success of mild cooperators (second order free riders).

*Traulsen, Hauert, De Silva, Nowak & Sigmund (2009) PNAS 106 709-712.*



# Sanctioning Institutions

## *Promoting cooperation - part IV*

- Second order free riders (contribute but do not punish) undermine punishing efforts.
- ↳ Even  $\alpha=1$  cannot prevent this because cannot identify among contributors.
- ↳ Establish punishment pool where individual contribute *before* engaging in the public goods interaction.
- ↳ Precursor to institutionalized punishment.
- ↳ Easy identification of free riders.
- Five strategic types
  - cooperators  $x$  - contribute to public goods, do not punish
  - defectors  $y$  - participate but do not contribute, do not punish
  - loners  $z$  - do not participate
  - peer punishers  $w$  - contribute and punish those that did not contribute
  - pool punishers  $v$  - contribute to public goods *and* to punishment pool
- Pool punishers pay an additional amount  $G > 0$  into the punishment pool and free riders are fined proportional to the number of pool punishers  $N_v$ :  $N_v G$ .



# Peer versus pool punishment

*No second order punishment,  $\alpha=0$*

■ Payoffs (infinite populations)

$$\begin{aligned}
 P_x &= P'_x - \alpha Gv(N-1) \\
 P_y &= P'_y - Gv(N-1) \\
 P_z &= \sigma \\
 P_w &= P'_w - \alpha Gv(N-1) \\
 P_v &= \underbrace{P'_x}_{\text{public goods with peer punishment}} \underbrace{- G}_{\text{pool punishment}}
 \end{aligned}$$

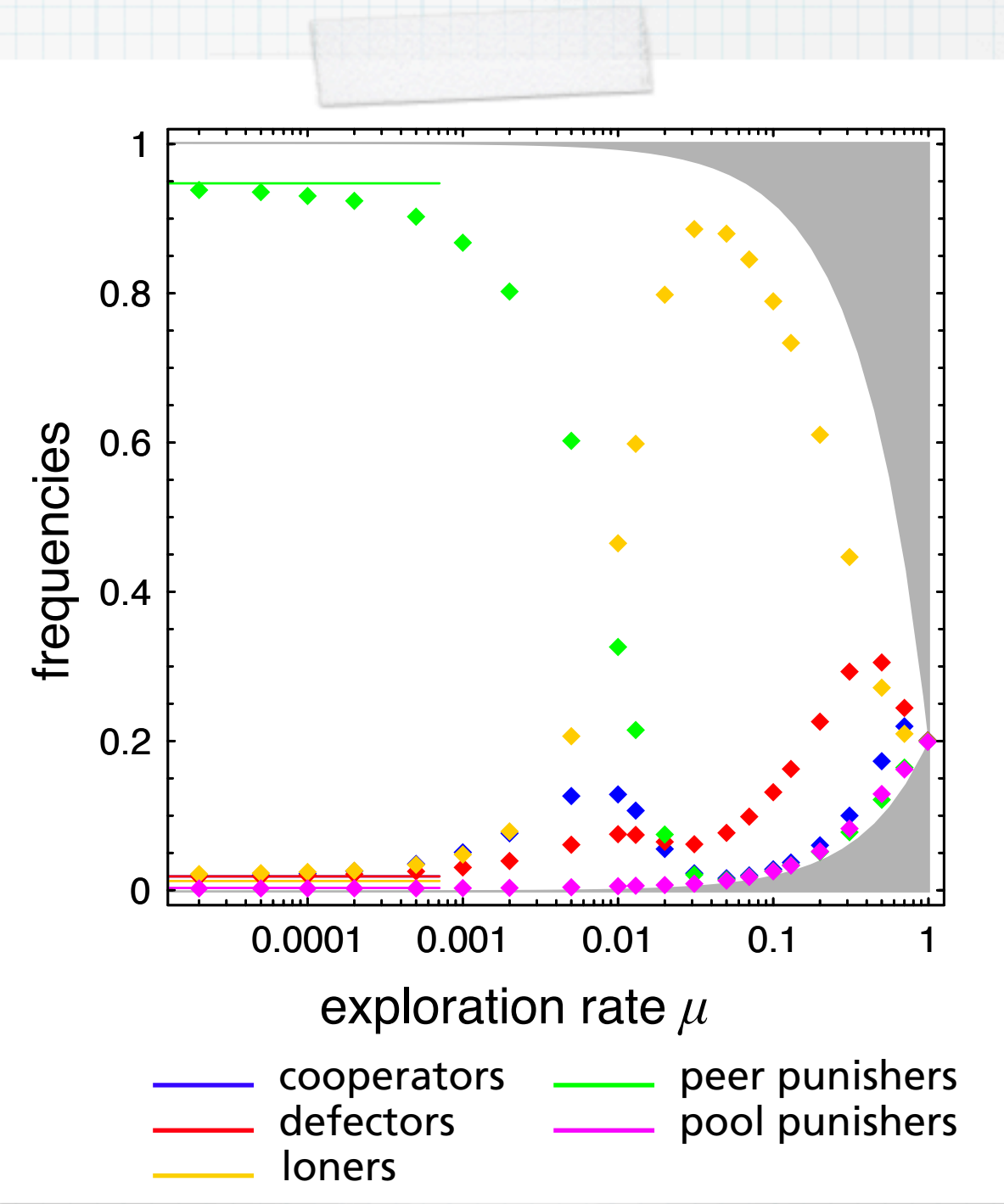
■ Punishment pool only used to punish non-contributors (defectors).

➤ For small  $\mu$  peer-punishment dominates.

➤ For large  $\mu$  the public good collapses.

➤ Pool punishment ineffective.

■ For compulsory interactions (no loners) defectors dominate.

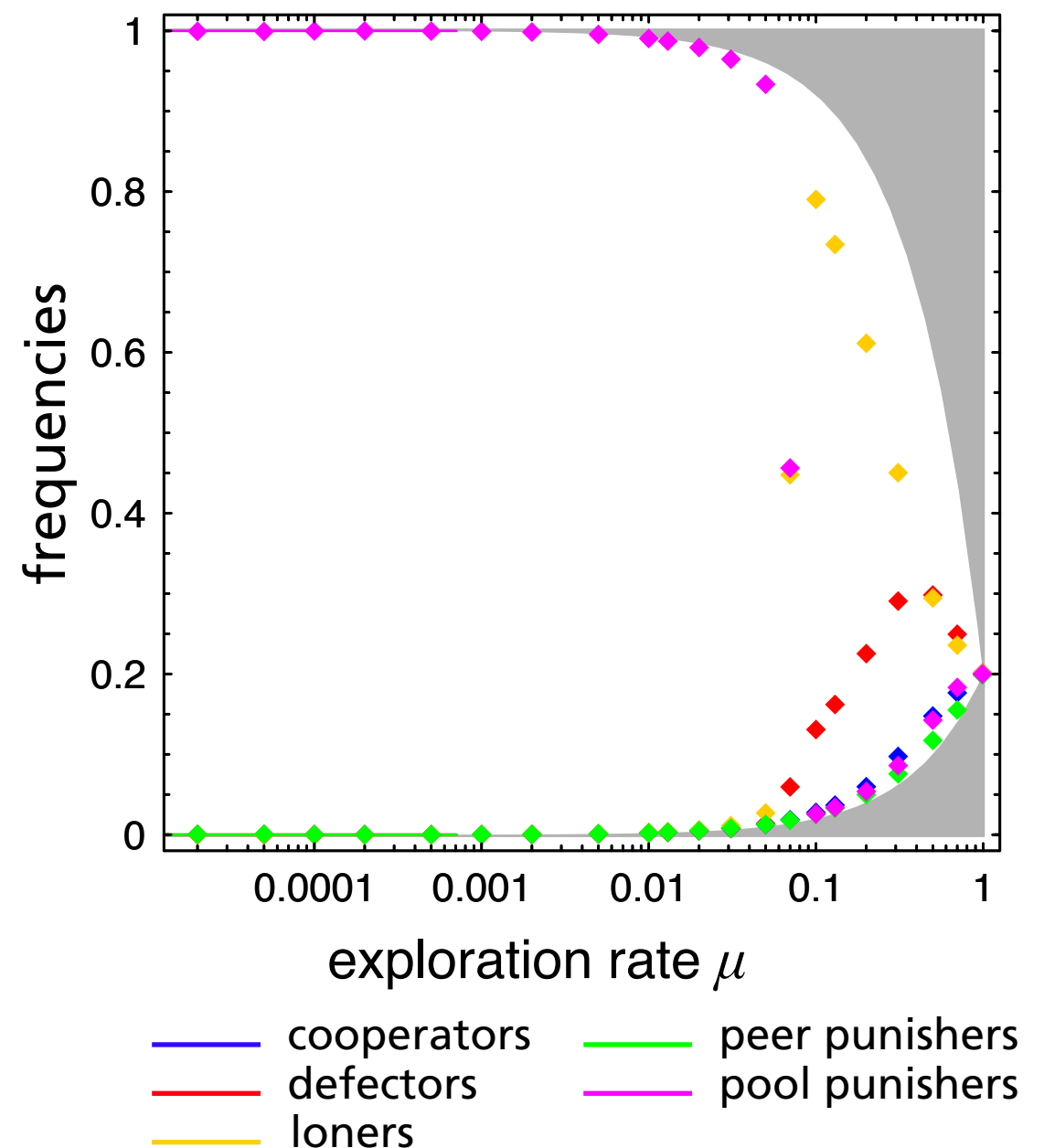


# Peer versus pool punishment

*With second order punishment,  $\alpha=1$*

- Punishment pool used to punish non-contributors (defectors) as well as those that do not commit to pool-punishment (cooperators and peer-punishers).
- ⇒ Pool punishers prevail for most  $\mu$ .
- ⇒ For very large  $\mu$  the public good collapses.
- For compulsory interactions (no loners) defectors again dominate.
- ⇒ Punishment often fails in compulsory public goods.
- ⇒ Preservation of global resources (climate, air, water, fish...).
- ⇒ "Mutual coercion mutually [and voluntarily] agreed upon". Hardin, 1968

*Sigmund, De Silva, Traulsen & Hauert  
(2010) Nature 466 861-863.*

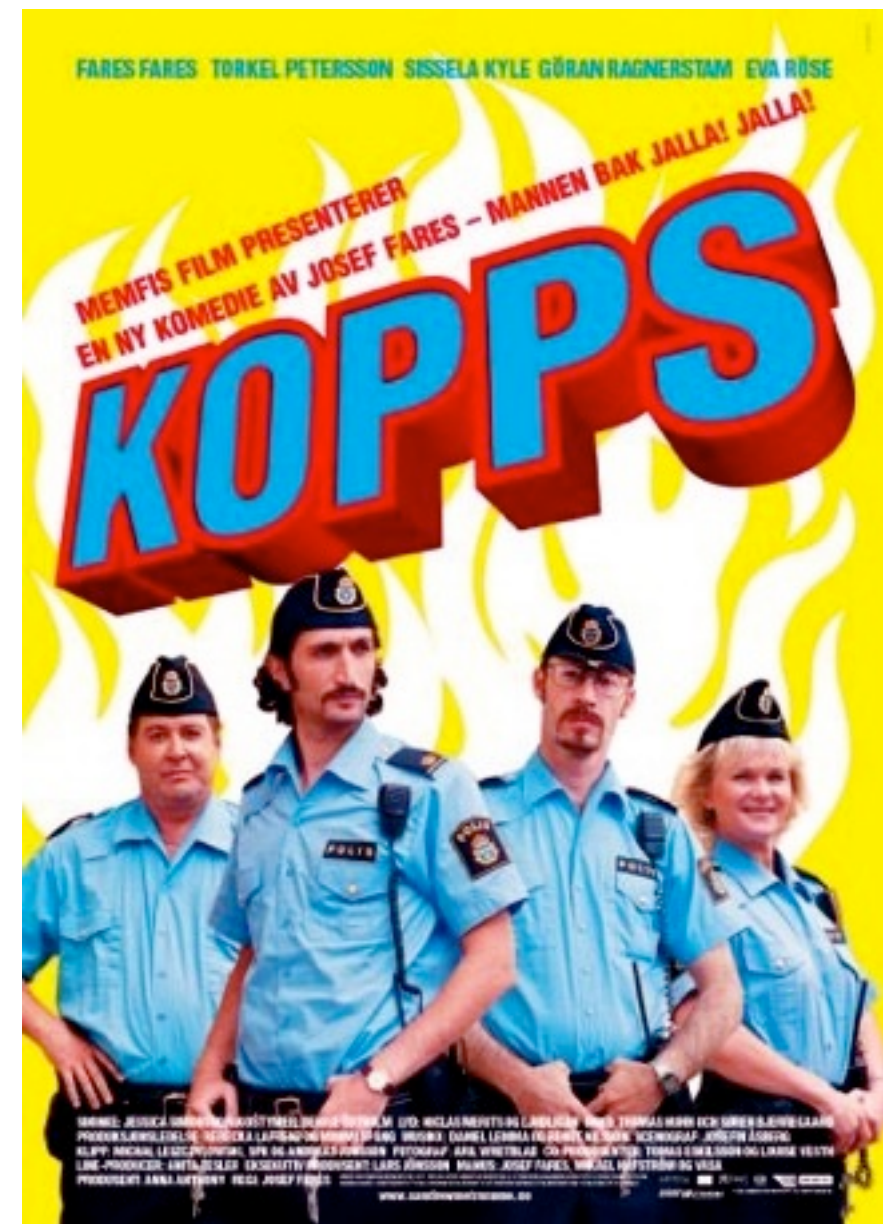




# Conclusions

## *Sanctioning Institutions*

- Peer punishment relates to the instinct for revenge.
- Pool punishment as a step towards establishing sanctioning institutions: commit resources to prepare for punishing free-riders.
- ↳ Pool punishment is based on foresight rather than anger.
- Populations of peer punishers are better off than pool punishers.
- ↳ The upkeep of the punishment pool incurs costs.
- With second order punishment, pool punishers prevail.
- ↳ Higher efficiency of peer punishment is traded for greater stability of pool punishment.



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## **Tutorials:**

*<http://www.univie.ac.at/virtuallabs>  
and soon <http://www.evoludo.org>*



VirtualLabs installation on 3D NOVA display  
Location: main train station Zürich, Switzerland  
Media artist: Chandrasekhar Ramakrishnan