Conceptual perspectives on the problem of cooperation

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Single-level selection models
Multi-level selection models











"Black"

"White"





"Black"

"White"



"Black"

"White"



"Black"

"White"













More black balls in "White" jar than white balls in "Black" jar? Or vice versa?



1000 white balls



1000 white balls





1000 white balls







"White"

1000 white balls, 250 black balls

"Black"





1000 white balls, 250 black balls



250 balls, say: 193 white balls 57 black balls





"White"

1000 white balls, 250 black balls

"Black"



250 balls, say: 193 white balls 57 black balls





"White"

807 white balls 193 black balls

"Black"



807 white balls 193 black balls 807 black balls 193 white balls



"Black"



807 white balls 193 black balls



"Black"

"White"





"White"



Easy explanation: After exchange, same amount of balls in both jars

- C (Cooperator): contributes b to public good at cost c (b > c > 0)
- D (Defector): contributes 0 at no cost
- Interaction group with N individuals: k Cooperators, N-k Defectors
- $k \cdot b$ = public good produced; distributed equally among all group members, each gets $(k \cdot b)/N$

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D			

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D	0	kb/N	kb/N	
Within any given interaction group, C always does worse than (even with "weak altruism", $b/N - c > 0$)				

Population-wide payoffs: average payoff from many different interaction groups

- e_c = # cooperators among N-1 other members of an average interaction group of focal C (average interaction environment of a focal C)
- e_D = # cooperators among N-I other members of an average interaction group of focal D (average interaction environment of a focal D)

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C wins if: $e_C + (1 - \frac{cN}{b}) > e_D$			

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condition for the evolution of cooperation:

$$e_C + (1 - \frac{cN}{b}) > e_D$$

Strong altruism (b/N - c < 0) requires $e_c > e_D$

Cooperators must have a more cooperative interaction environment than defectors: **assortment** among cooperators

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Note: weak altruism is not enough in general if there is negative assortment ($e_c < e_D$)

Chuang et al, "Simpson's Paradox in a Synthetic Microbial System" Science, 2009

Two E. coli strains:

- strain A secretes inducer of antibiotic resistance (at a cost); inducer = public good
- strain B doesn't produce inducer

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Weak altruism:

when growing in isolation from small initial densities, strain A grows faster than strain B



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- common pool of A and B strongly diluted and distributed in many different wells
- growth, then pooling of all well populations, etc



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Result: evolution of cooperation (producers increase in pooled frequency)



"Complicated" explanation: Simpson's paradox



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Easy explanation: random interaction groups, weak altruism

 $e_C = \#$ cooperators among N-I other members of an average interaction group of focal C $e_D = \#$ cooperators among N-I other members of an average interaction group of focal D

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Examples related to "group selection":

1. Every interaction group contains exactly k cooperators (no variation between groups):

 $e_C = k - 1$ $e_D = k$

C never wins...

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Examples related to "group selection":

1. Every interaction group contains exactly k cooperators (no variation between groups):

$$e_C = k - I$$

 $e_D = k$
C never wins...

- 2. Only two types of interaction groups: all cooperators, or all defectors (maximal group variation):
 - $e_C = N I$ $e_D = 0$ C always wins...

condition for the evolution of cooperation:

$$e_C + (1 - \frac{cN}{b}) > e_D$$

Relation to kin selection: "Hamilton's rule"

$$(\frac{e_C + 1 - e_D}{N})b > c$$

"average excess relatedness" among C players

• Maintenance of cooperation in the Spatial Prisoner's Dilemma (cluster formation)



Nowak and May, Nature, 1992

• Example from Ackermann et al, Nature, 2008

Mechanisms for assortment ($e_C > e_D$): Spatial structure

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green: isogenic cells expressing virulence factor grey: isogenic cells not expressing virulence factor

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TTSS-I⁻ remains in lumen

TTSS-I⁺ migrates to gut wall



b 100. Gut lumen Percentage with TTSS-1⁺ phenotype 80 TTSS-1⁻ remains in lumen +) TTSS-1+ nvasion 60 TTSS Gut tissue 40 TTSS-I⁺ migrates to gut wall (+ (+ 20 TSS ITSS-0 Gut lumen Gut tissue d Inflammation intensity B₍₊₎6 Gut lumen -) #TTSS-I⁺ in gut wall correlates Inflammation Gut tissue with inflammation (public good) + + TSS-1 TSS 0 50 100 10 0 1 S. typhimurium in inoculum that are capable of expressing TTSS-1+ phenotype (%) f 104 Gut lumen -) (+) **C** Gut tissue Antibacterial defense 10 Wild-type Mice lacking antimice bacterial defense systems (Cybb/Nos2)



S. typhimurium public goods game

- single deme (single host) is seeded by M individuals, deme grows to population size N
- public goods game in each deme: D does nothing; with probability q, C commits suicide to provide benefit b
- payoffs in deme with k cooperators:

$$p_C(k) = (1 - q) \left((k - 1)qb + w \right)$$
$$p_D(k) = kqb + w$$

Spatial structure: deme seeded by *M* individuals from global pool

Average interaction environment of focal C:



$$e_C(x) = x(M-1)\frac{N}{M} + \frac{N}{M} - 1$$

x = global frequency of C

Average interaction environment of focal D:



$$e_D(x) = x(M-1)\frac{N}{M}$$

x = global frequency of C

Note:
$$e_C(x) - e_D(x) = \frac{N}{M} - 1 > 0$$

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 $P_C = (1 - q)((e_C(x)qb + w))$ $P_D = e_D(x)qb + w$



from Ackermann et al, Nature, 2008

Adaptive dynamics: competition between different suicidal strategies q_{res} and q_{mut}

Average payoff to rare q_{mut} :



$$P_{q_{mut}} = (1 - q_{mut}) \left[q_{mut}b(\frac{N}{M} - 1) + q_{res}b\frac{(M - 1)N}{M} \right]$$

Average payoff to common q_{res} :



$$P_{q_{res}} = (1 - q_{res}) \left[q_{res} b(N - 1) \right]$$

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Mechanisms for assortment : Conditional behaviour

Example (from Fletcher and Zwick 2007): Tit-for-Tat in the Iterated Prisoner's Dilemma x = frequency of TFT, I-x = frequency of AlID, N iterations interaction environment of TFT player: xN cooperative acts interaction environment of AlID player: x cooperative acts

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Tit-for-Tat generates assortment between cooperators and cooperative behaviours of others
Conclusions for single-level selection models:

 Evolution of cooperation requires different interaction environments for cooperators and defectors (positive assortment between cooperative genotypes and cooperative behaviour of others) Note: equally applies to interspecific mutualism

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Conclusions for single-level selection models:

- Evolution of cooperation requires different interaction environments for cooperators and defectors (positive assortment between cooperative genotypes and cooperative behaviour of others) **Note:** equally applies to interspecific mutualism
- The concepts of kin selection (Hamilton's rule) and group selection (Price equation) are not necessary for understanding the evolution of cooperation; they are merely different fitness accounting techniques.
- **The biological problem:** understanding the mechanisms that lead to assortment (spatial structure, conditional behaviour, ...)

2. Multi-level selection models

Traditional group selection models:

- Group properties derived from properties of the individuals in a group (e.g. "productivity"=average individual fitness)
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"True" group selection models:

- Need birth-death process at both the individual and the group level
- Basic assumption: population consists of "groups of individuals" (e.g. groups of individual pathogens defined as those living in a single host; tribes of hunter-gatherers,...)

A generic group selection model

Individuals can have types {1,2,...k}

A group is specified by a vector $x = (x_1, \ldots, x_k)$

 $x_i =$ number of i - individuals in the group

Basic quantity:

 $\Theta(x,t) =$ number of x - groups in the population at time te.g. $G(t) = \int \Theta(x,t)dx =$ number groups at time t $N_i(t) = \int x_i \Theta(x,t)dx =$ number of type i individuals at time t

Goal: understand the dynamics of $\Theta(x,t)$

Individual-level events: birth, death (and migration) of individuals

 $b_i(x,t) =$ birth rate of *i* individuals in groups of composition x $d_i(x,t) =$ death rate of *i* individuals in groups of composition x

Group level events: fissioning and extinction of groups (and possibly fusion)

- f(x,t) = fissioning rate of x groups
 - h(u, x) = fissioning density: distribution of groups formed when an x group is fissioning

$$e(x,t) =$$
 extinction rate of x groups

Note:

- all rates can be affected by interactions, group composition, total number of individuals and groups, etc.
- fissioning and extinction rates of groups can be affected by games between groups (e.g. in cultural evolution)

"Master equation" for group selection: $\frac{\partial \left(\Theta(x,t)(b_i(x,t)-d_i(x,t))\right)}{\partial x_i} \neq$ $\frac{\partial \Theta(x,t)}{\partial \theta(x,t)}$ $f(y,t)\Theta(y,t)h(x,y)dy - (e(x,t) + f(x,t))\Theta(x,t)$ dynamics due individual level events dynamics due to group level events

Definition: A trait evolves by group selection if it establishes itself when group-level events are present in the model, and does not establish itself in the same model when they are absent.

Example: evolution of cooperation in hunter-gatherer tribes

Basic assumptions:

- Defectors have higher birth rates than cooperators in every tribe
- Larger tribes, and tribes with a larger proportion of defectors, are more likely to fission
- Smaller tribes, and tribes with a larger proportion of defectors, are more likely to die of extinction.



Video of a stochastic version of the model





Figure 1a

Example: evolution of "multicelluarity" (sticky cells)

Basic assumptions:

- Two kinds of cells: "sticky" and "normal"
- Groups = "organisms" d_{o} onsisting of a number d_{f} stick want normal cells

- Normal cells reproduce at a faster rate than sticky cells
- Stickier organisms ar less likely to fission and more likely to fuse
- Smaller organisms are more likely to be eaten by predators



equilibrium configuration

Example: evolution of cooperation in groups playing public goods games

Basic assumptions:

- Groups consist of Cooperators and Defectors
- Individual birth rates are given by payoffs from public goods game (logistic death rates)
- Larger groups and groups with larger proportions of Cooperators are less likely to go extinct
- Groups with larger proportions of Defectors cooperators are more likely to fission

Dynamics of assortment



- Assortment (or relatedness) are instantaneous measures that can only predict short term dynamics
- Dynamics of assortment (or relatedness) are determined by group level events and are needed to predict long-term dynamics



Summary

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- Evolution of cooperation requires different interaction environments for cooperators and defectors (positive assortment between cooperative genotypes and cooperative behaviour of others)
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Multi-level selection models:

- Require birth and death processes at multiple levels (e.g. at the individual and at the group level)
- In such models, events that affect birth and death rates at the group level must be taken into account, e.g to understand the dynamics of assortment
- However, assortment at the individual level is in general not enough to understand the dynamics cooperation in multi-level models (e.g. when there are games between groups)