

Dirk Helbing (ETH Zurich)



From Computational Social Science to Global Systems Science

FuturICT



The Problems of the World Are Complex



Source: ddp images/Marcus Brandt

<http://www.sueddeutsche.de/politik/streit-beigelegt-einigung-ueber-foederalismusreform-1.413140>

Financial Crisis



Conflict, War



BREAKING NEWS

10 MINUTES
NON-STOP
NEWS

295 KILLED IN MALAYSIA AIRLINES DISASTER

PLANE GOES DOWN IN UKRAINE

Climate Change



Globally networked risks and how to respond

Dirk Helbing^{1,2}

Today's strongly connected, global networks have produced highly interdependent systems that we do not understand and cannot control well. These systems are vulnerable to failure at all scales, posing serious threats to society, even when external shocks are absent. As the complexity and interaction strengths in our networked world increase, man-made systems can become unstable, creating uncontrollable situations even when decision-makers are well-skilled, have all data and technology at their disposal, and do their best. To make these systems manageable, a fundamental redesign is needed. A 'Global Systems Science' might create the required knowledge and paradigm shift in thinking.

Globalization and technological revolutions are changing our planet. Today we have a worldwide exchange of people, goods, money, information, and ideas, which has produced many new opportunities, services and benefits for humanity. At the same time, however, the underlying networks have created pathways along which dangerous and damaging events can spread rapidly and globally. This has increased systemic risks¹ (see Box 1). The related societal costs are huge.

When analysing today's environmental, health and financial systems or our supply chains and information and communication systems, one finds that these systems have become vulnerable on a planetary scale. They are challenged by the disruptive influences of global warming, disease outbreaks, food (distribution) shortages, financial crashes, heavy

'Global Systems Science', in order to understand better our information society with its close co-evolution of information and communication technology (ICT) and society. This effort is allied with the "Earth system science"¹⁰ that now provides the prevailing approach to studying the physics, chemistry and biology of our planet. Global Systems Science wants to make the theory of complex systems applicable to the solution of global-scale problems. It will take a massively data-driven approach that builds on a serious collaboration between the natural, engineering, and social sciences, aiming at a grand integration of knowledge. This approach to real-life techno-socio-economic-environmental systems⁸ is expected to enable new response strategies to a number of twenty-first century challenges.

Global Systems Science

Humans have created **tightly connected systems** and networked risks, which has led to **a world we do not understand and cannot control well**. Systemic risks and extreme events are consequences of this.

However, systemic instabilities can be understood by a change in perspective from a component-oriented to **an interaction- and network-oriented view**. This also entails a fundamental change in the design and management of complex dynamical systems. Establishing a "Global Systems Science" will allow us to better understand our **information society with its close co-evolution of information and communication technology (ICT) and society**. This effort is allied with the "earth system science" that now provides the prevailing approach to studying the physics, chemistry and biology of our planet.

Global Systems Science makes current theories of crises and disasters applicable to the **solution of global-scale problems, taking a massively data-driven approach** that builds on a serious collaboration between the natural, engineering, and social sciences, i.e. a **grand integration of knowledge**.



The Micro-Macro Problem

Dirk Helbing
and Michael Mäs

„The Whole is More than the Sum of Its Parts“

The “whole does not equal the sum of its parts; it is something different, whose properties differ from those displayed by the parts from which it is formed.” (Durkheim 1982:128)

“The determining cause of a social fact must be sought among antecedent social facts and not among the states of the individual consciousness.” (Durkheim 1982:134)





Modeling the Breakdown and Emergence of Coordination or Cooperation

Dirk Helbing

with Thomas Chadeaux, Wenjian Yu, Thomas Grund, Christian Waloszek,
Carlos Roca, Sergi Lozano, Matjaz Perc, Attila Szolnoki,
and others

Enviromental Exploitation



Border between Haiti and Dominican Republic
© 2010 Google

Enviromental Pollution



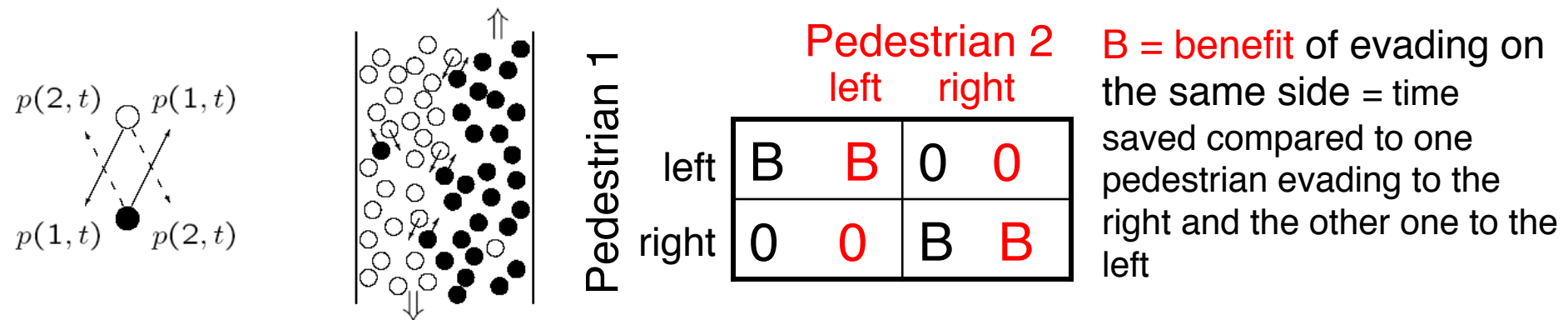
Public domain

Overfishing



Self-Organization of a Behavioral Convention

The result of a social interaction between two individuals is characterized by the “payoff”

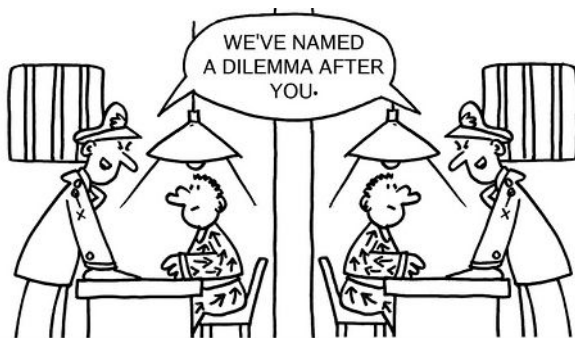


$$dp(i,t)/dt = -2rB[p(i,t)-1/2] p(i,t) [1-p(i,t)] \quad i=1: \text{right}, i=2: \text{left}$$

Only the stationary solutions $P(i,t)=0$ or 1 are stable, i.e. one evading side will become a **behavioral convention** (Helbing, 1990, 1991, 1992; Young 1993)

The Dilemma of Social Cooperation

The prisoner's dilemma assumes that, when two individuals cooperate, both get the “reward” R , while both receive the “punishment” $P < R$, if they defect. If one of them cooperates (“C”) and the other one defects (“D”), the cooperator suffers the “sucker’s payoff” $S < P$, while the payoff $T > R$ for the second individual reflects the “temptation” to defect. Additionally, one typically assumes $S+T < 2R$.



		Player 2	
		Cooperate	Defect
Player 1	Cooperate	R_1 R_2	S_1 T_2
	Defect	T_1 S_2	P_1 P_2

For example:

$$S_1 = S_2 = S = -5$$

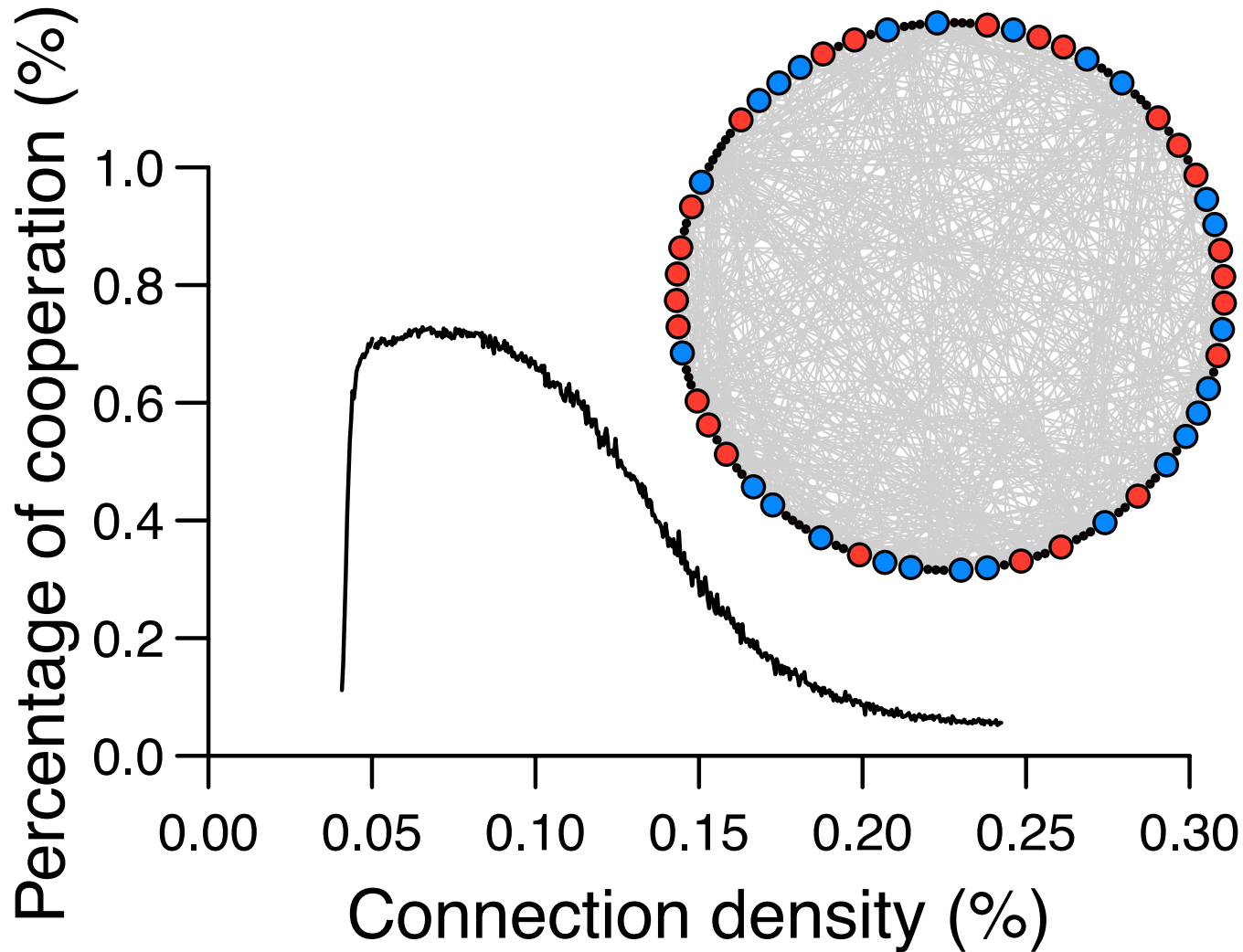
$$P_1 = P_2 = P = -2$$

$$R_1 = R_2 = R = -1$$

$$T_1 = T_2 = T = 0$$

Many “social dilemmas” are of a similar kind (see [public goods](#) game)

Too Much Connectivity Is Bad



How the Banking Network Changed

Chart 1: Global Financial Network: 1985

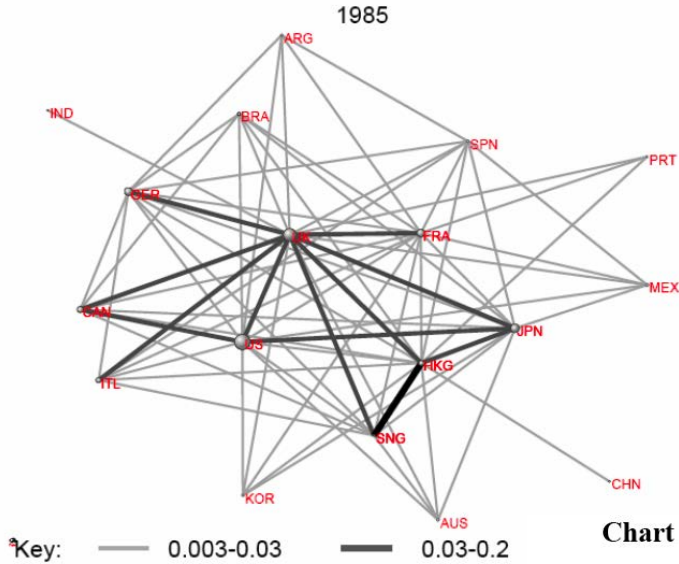


Chart 3: Global Financial Network: 2005

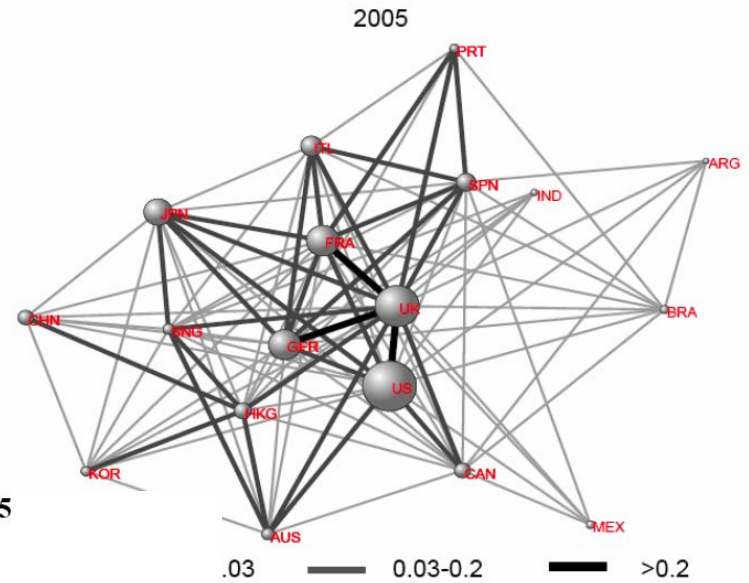
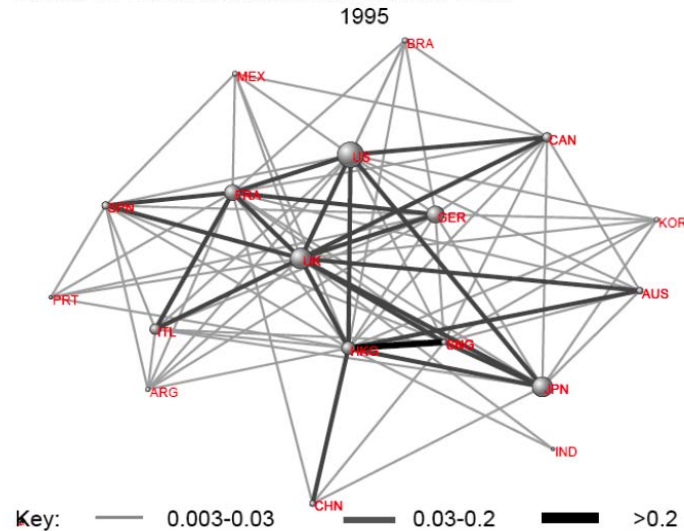


Chart 2: Global Financial Network: 1995



From: Haldane

Cascading Effects During Financial Crises



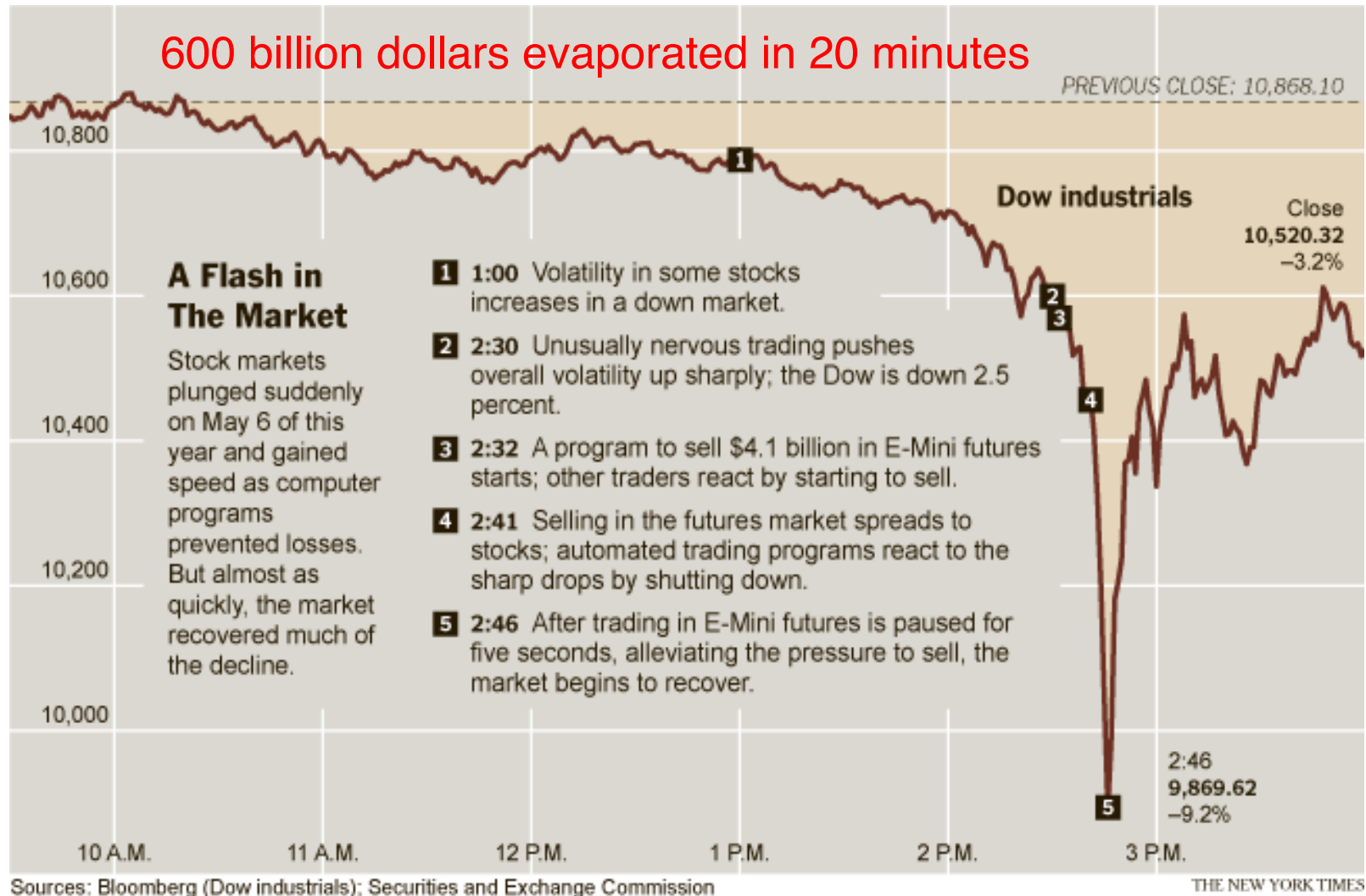
Video by Frank Schweitzer et al.

Loss of Control through Cascade Effects



Mousetrap fission, by Gerhard G. Paulus, University of Jena, <https://www.youtube.com/watch?v=Wiz1VVLYgl4>

The Flash Crash on May 6, 2010



The flash crash turned solid assets into penny stocks within minutes.
Was an interaction effect, no criminal act, 'fat finger', or error.

Engineered Breaking Points to Stop Cascades





Social Mechanisms and Institutions to Promote Cooperation

Dirk Helbing

with Wenjian Yu, Matjaz Perc, Attila Szolnoki,
Gzörgy Szabo, and Sergi Lozano

Pool Punishment (and Surveillance)



Flickr photo by nologo_photography. License: CC BY-SA 2.0.

Ferguson

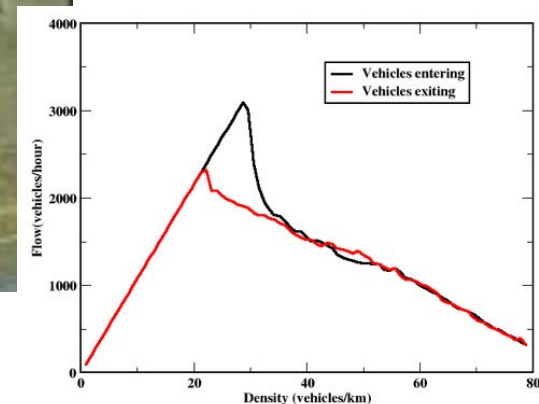


„Phantom Traffic Jams“ Can't Be Prevented Even When Knowing the Thoughts of People!



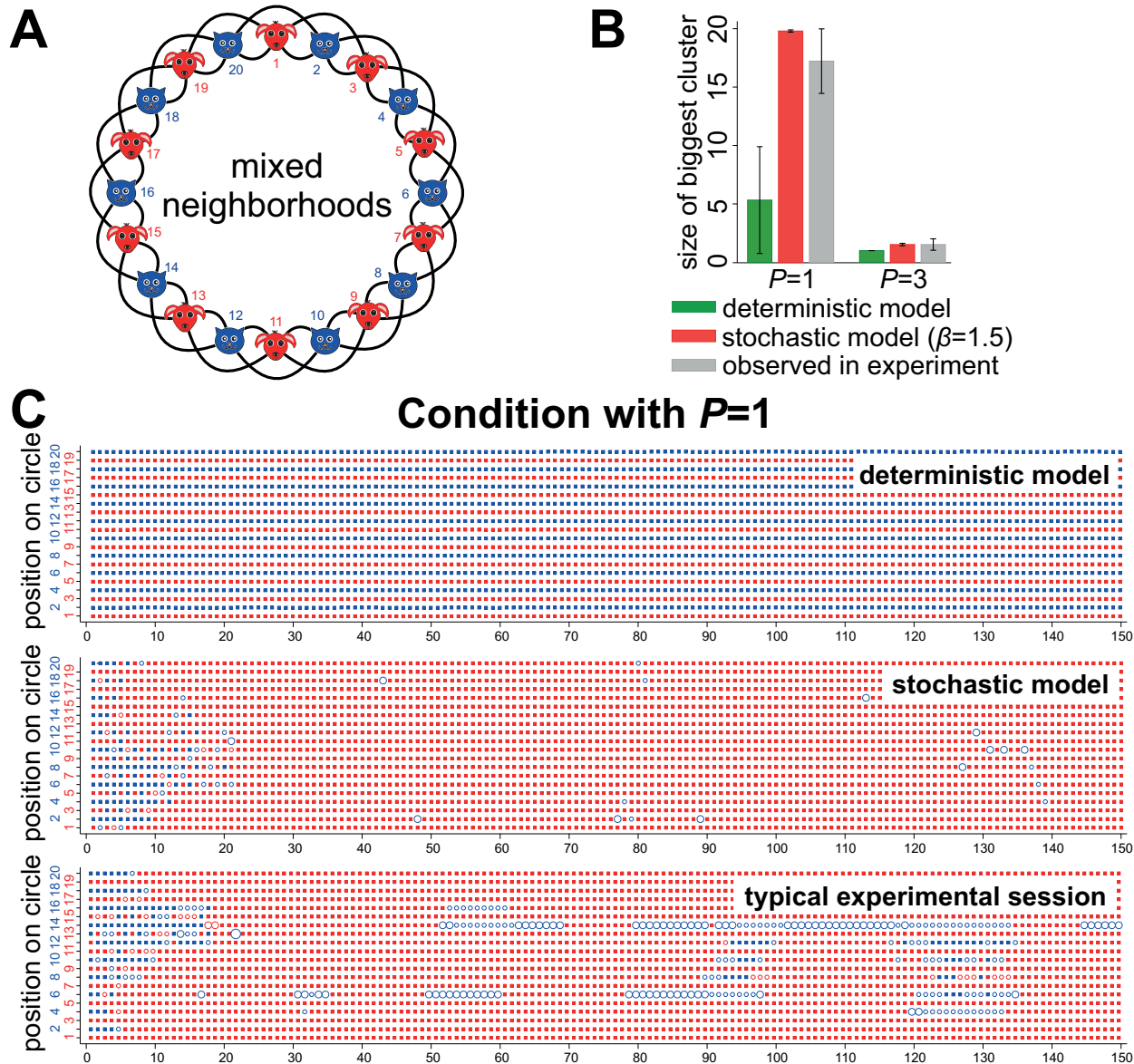
Thanks to
Yuki Sugiyama

Capacity drop,
when capacity
is most needed!



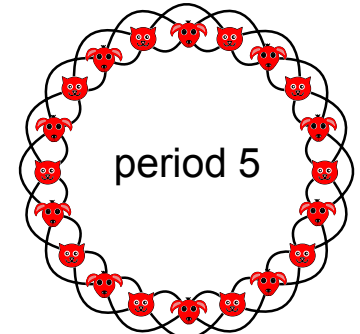
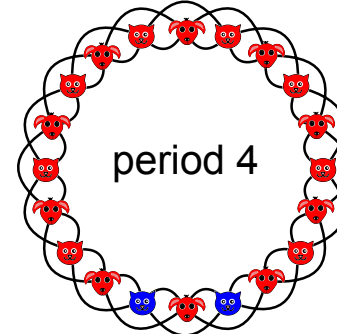
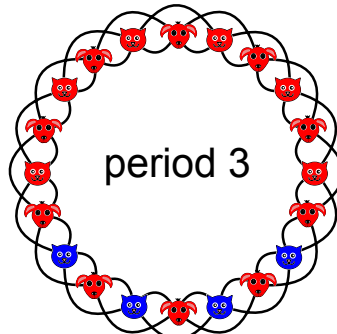
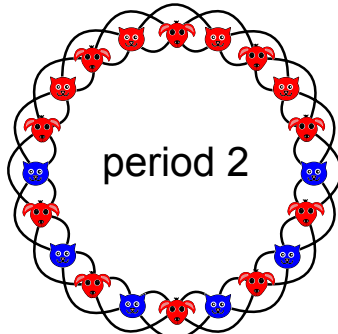
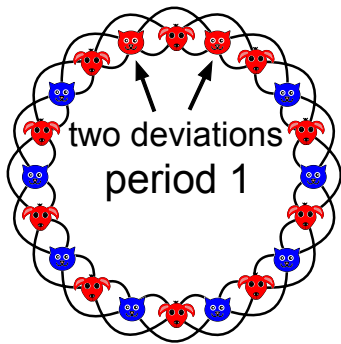
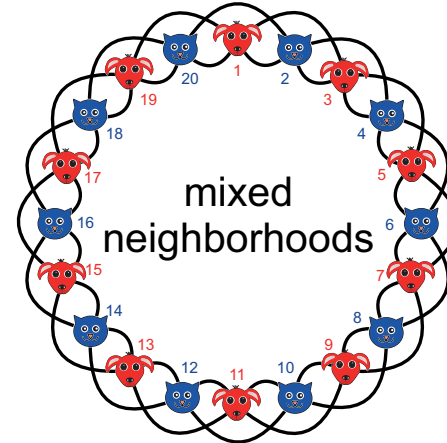
At high densities, free traffic flow is unstable:
Despite best efforts, drivers fail to maintain speed

A 96% Correct Micro-Model May Not Be Able to Predict the Macro-Outcome!

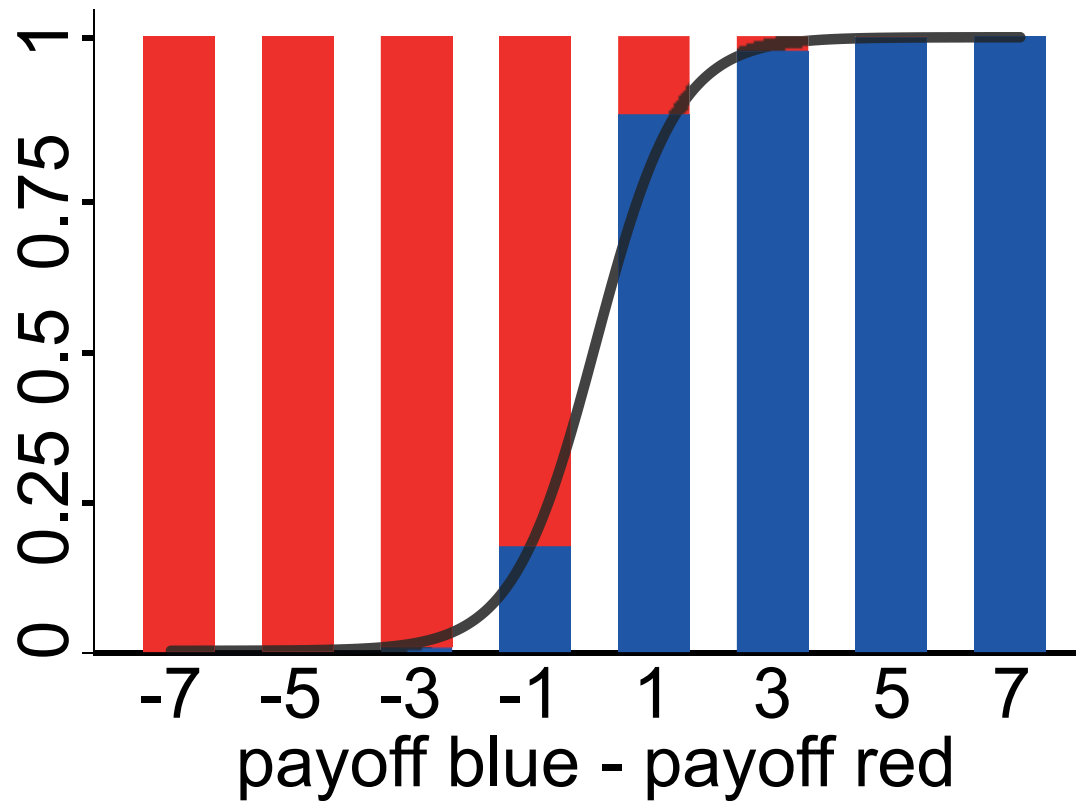


Michael
Mäs and DH

Noise on the Micro-Level Can Affect Macro-Level Outcomes



Adding “Noise” Yields Improved Results! Less Accurate Micro-Models May Reproduce Macro-Patterns Better

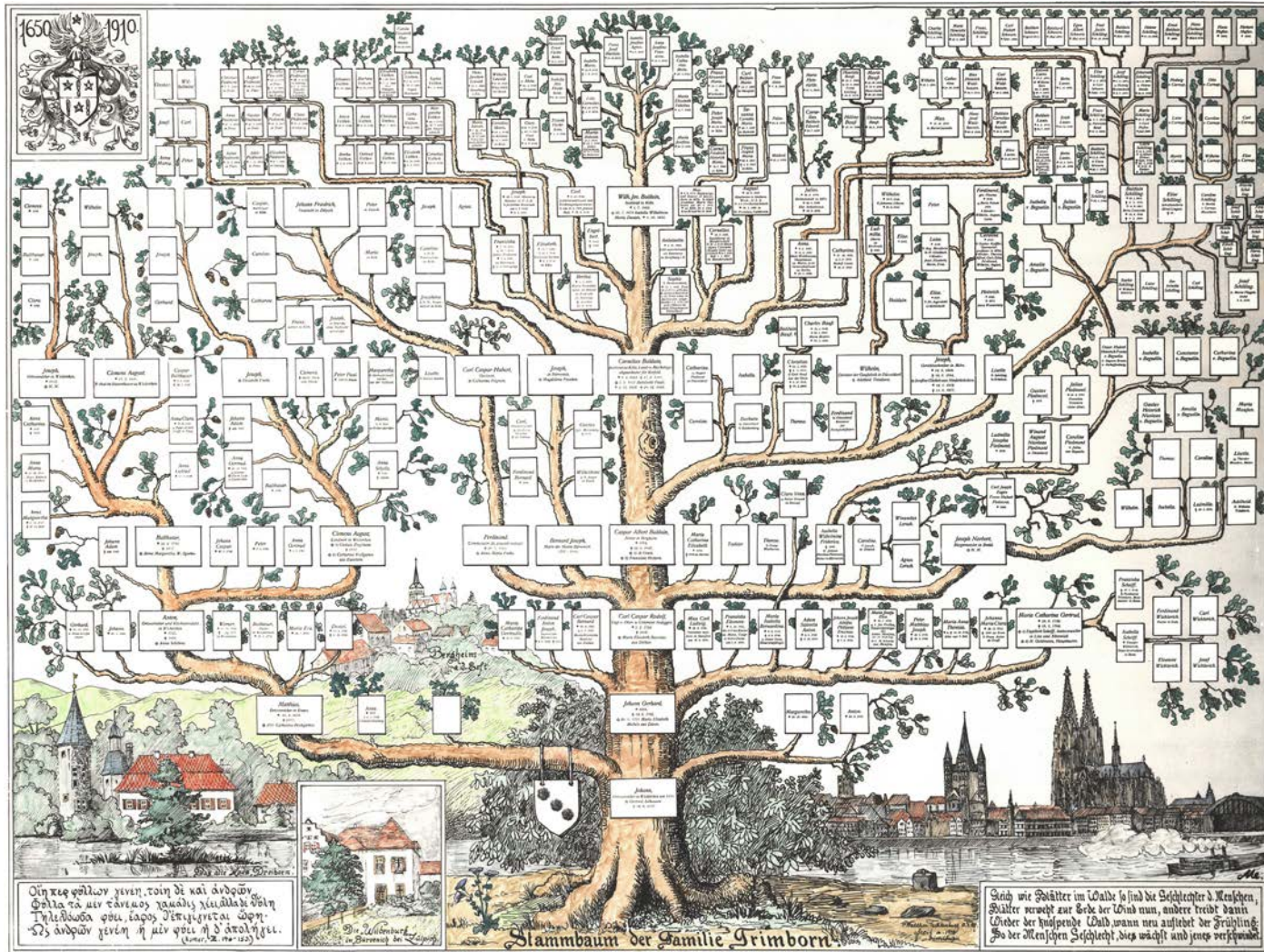


Michael
Mäs and DH

■ proportion of blue ■ proportion of red

— estimated probability of choosing blue ($\beta=1.5$)

Kin Selection, Genetic Favoritism

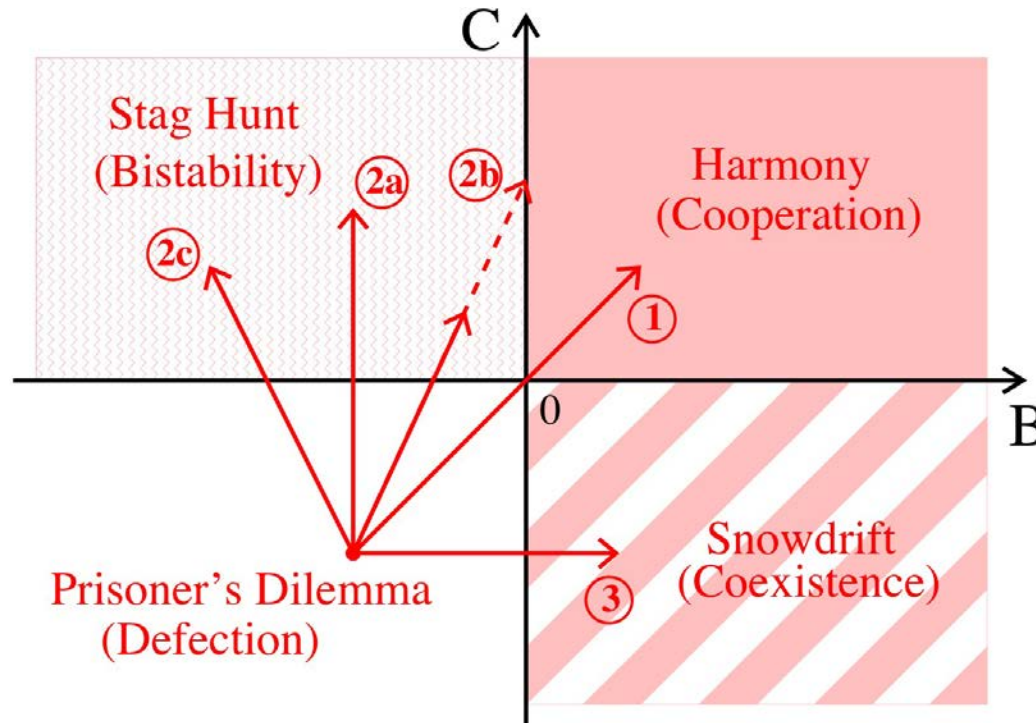


Direct Reciprocity



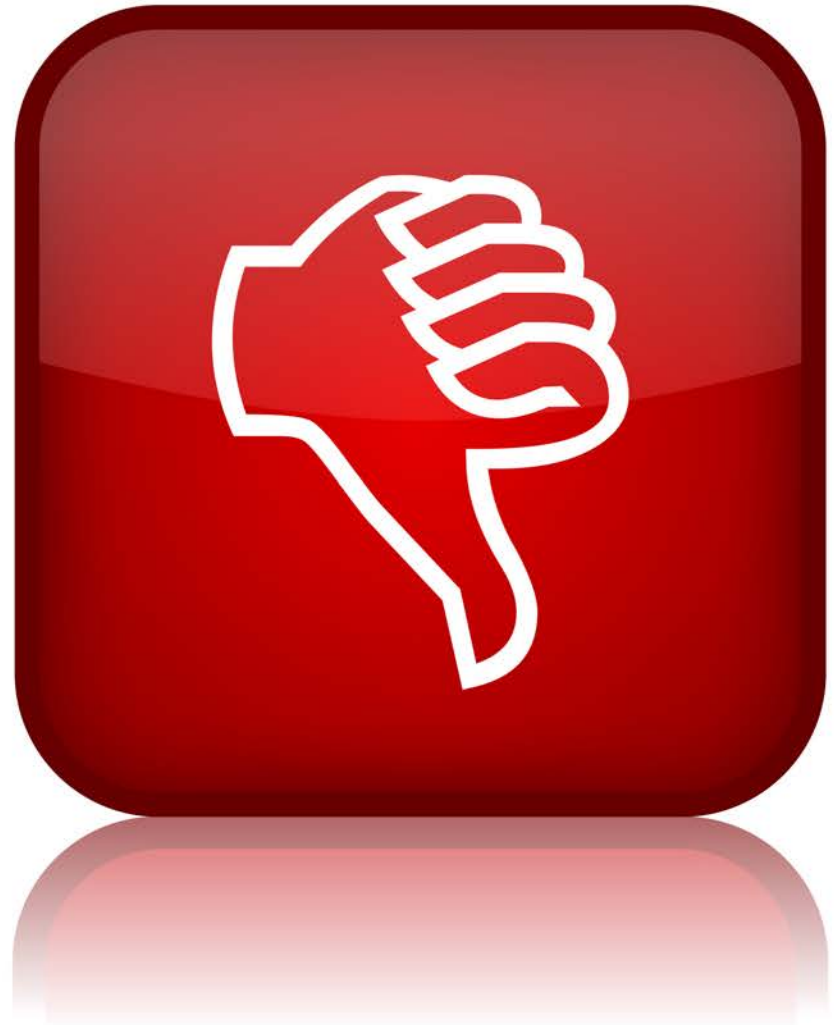
Routes to Cooperation

Routes to cooperation require to **destabilize defection** (PD \rightarrow SD) or to **stabilize cooperation** (PD \rightarrow SH) or both (PD \rightarrow HG)

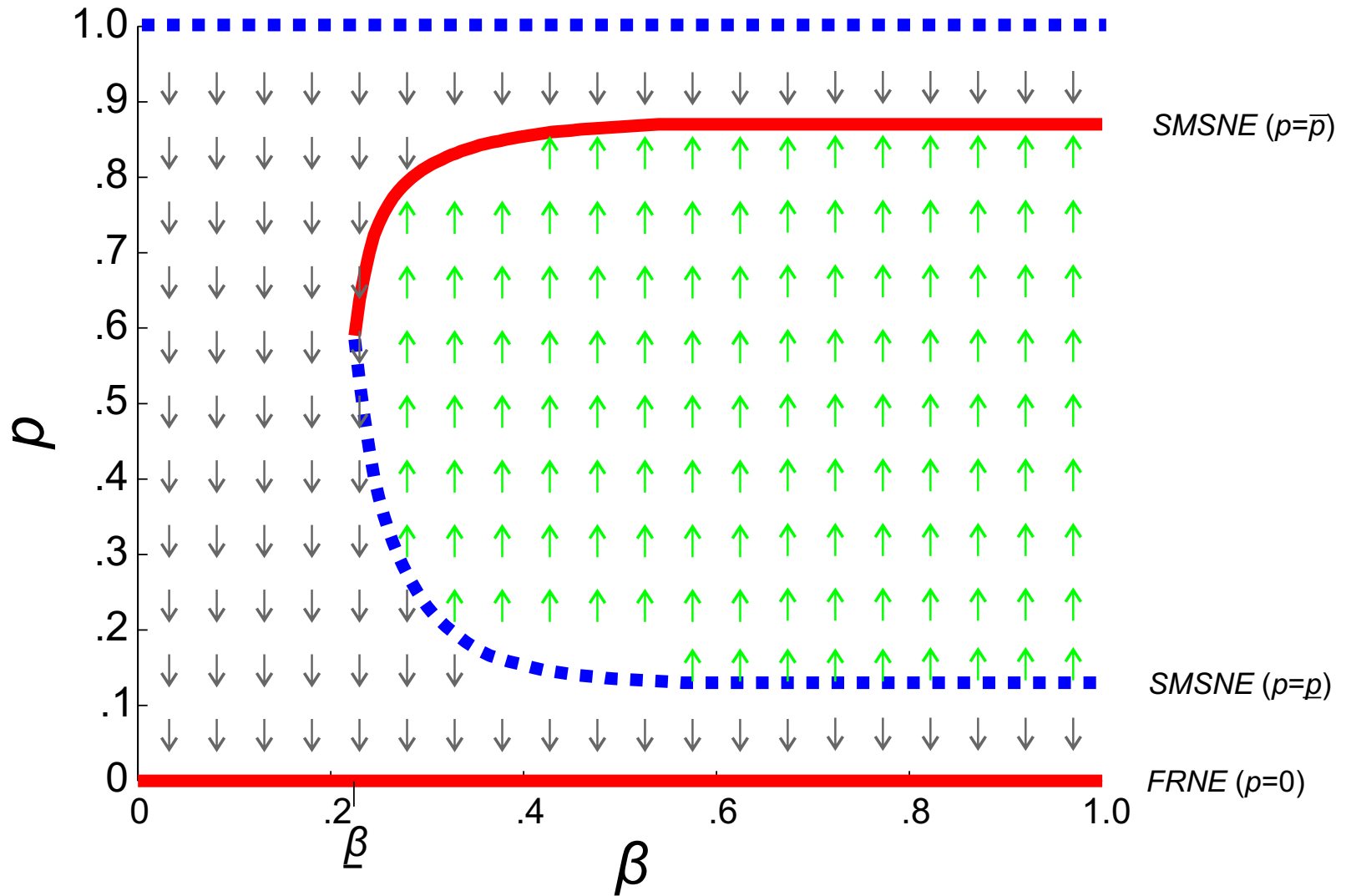


Route 1: Kin selection 2a: Direct reciprocity, 2b: Indirect reciprocity, 2c: Costly peer punishment, 3: Network interactions

Reputation, Indirect Reciprocity



Merit-Based Matching: Everyone Can Be Better Off



DH, with Heinrich Nax and Ryan Murphy

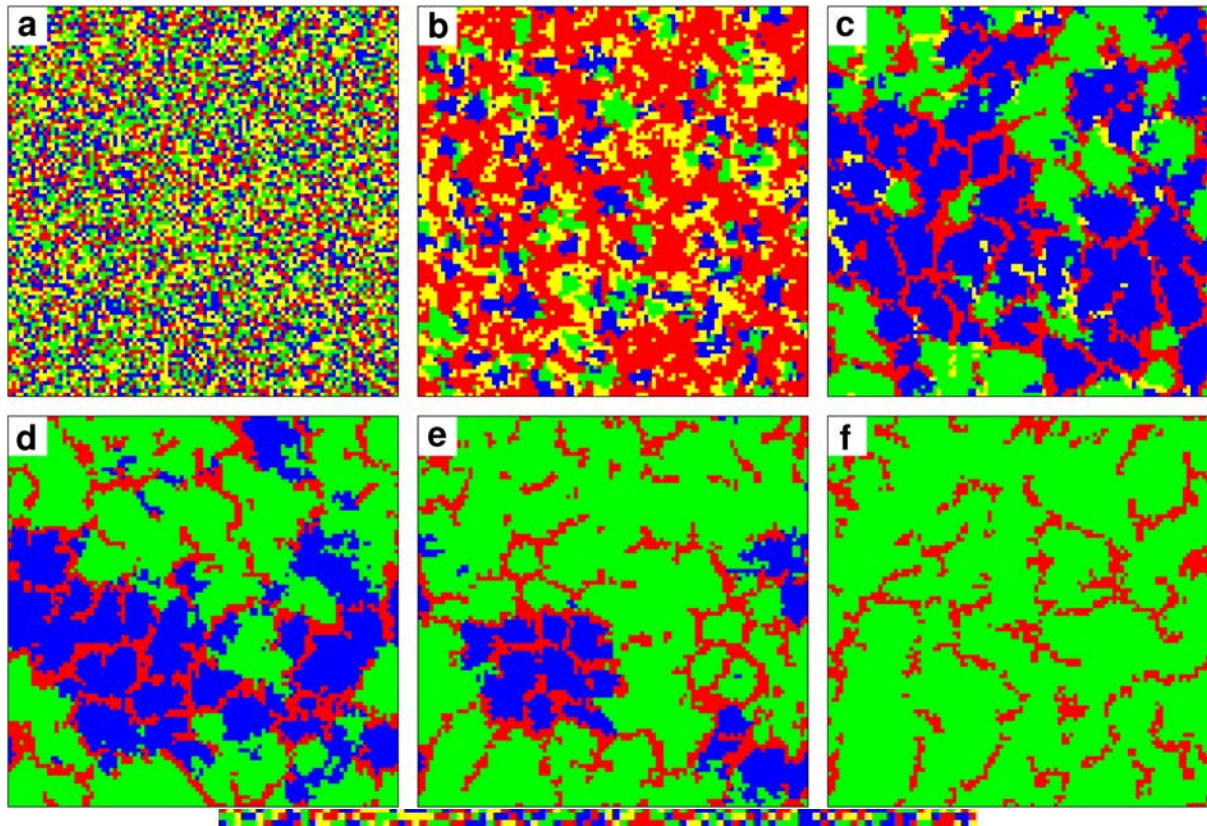
Competition of Mechanisms: Is Peer Punishment or Signaling Superior?



Characteristics of the game:

- Intergroup conflict
- Subjects are endowed with 1000 points in every period
- Each member of winning group gets 1000 points
- Chances of winning correspond to sum of contributions
- Nash equilibrium: 250 points per group

How Second-Order Free-Riders Are Eliminated and Punishment Spreads

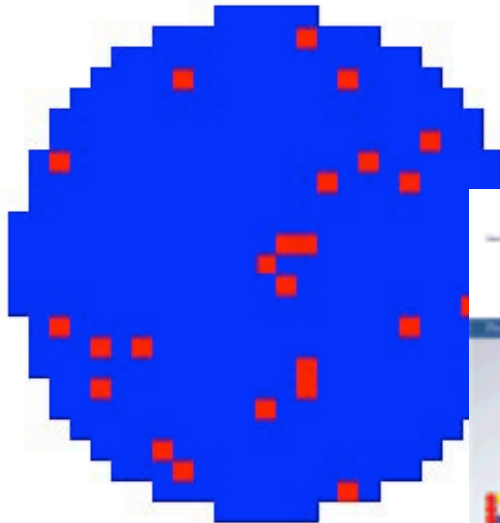


D = Defectors (free-riders), M = Moralists = cooperators punishing defectors, C = non-punishing Cooperators (second-order free-riders), I = Immoralists = defectors punishing other defectors

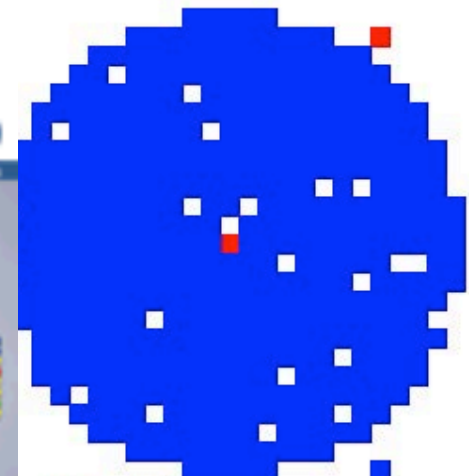
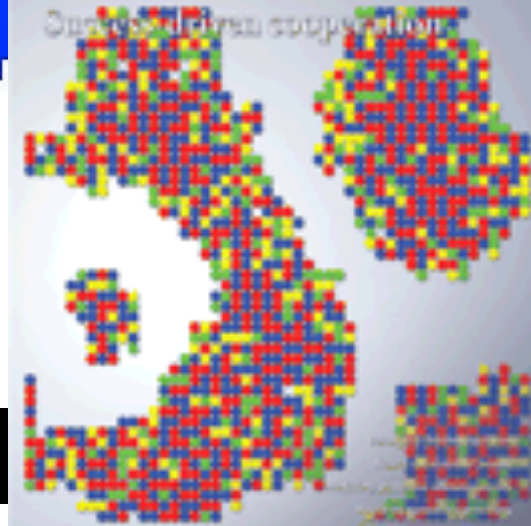
The Breakdown and Outbreak of Cooperation

Red, yellow: defectors (cheaters)

Blue, green: cooperators



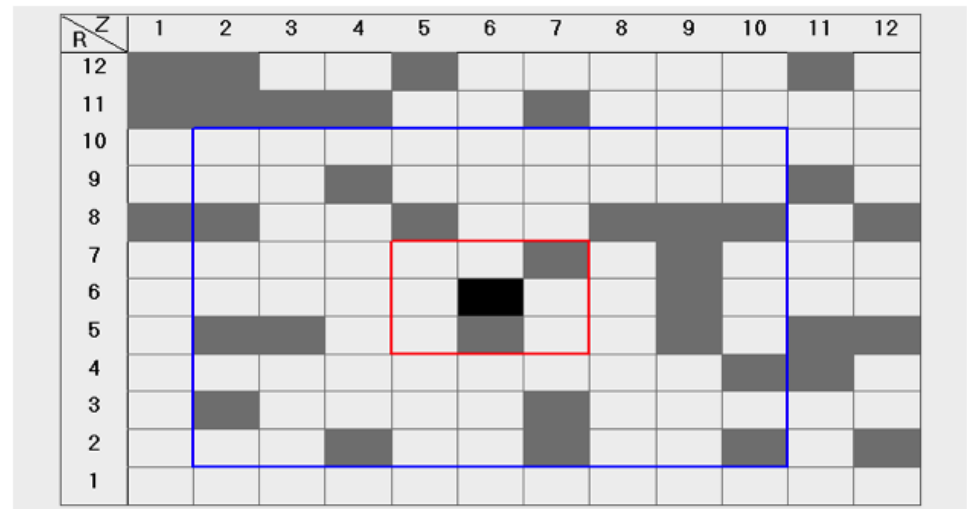
PNAS



Public Good Game with Mobility: Experimental Design



Joint work with Carlos Roca,
Charles Efferson and Sonja Vogt



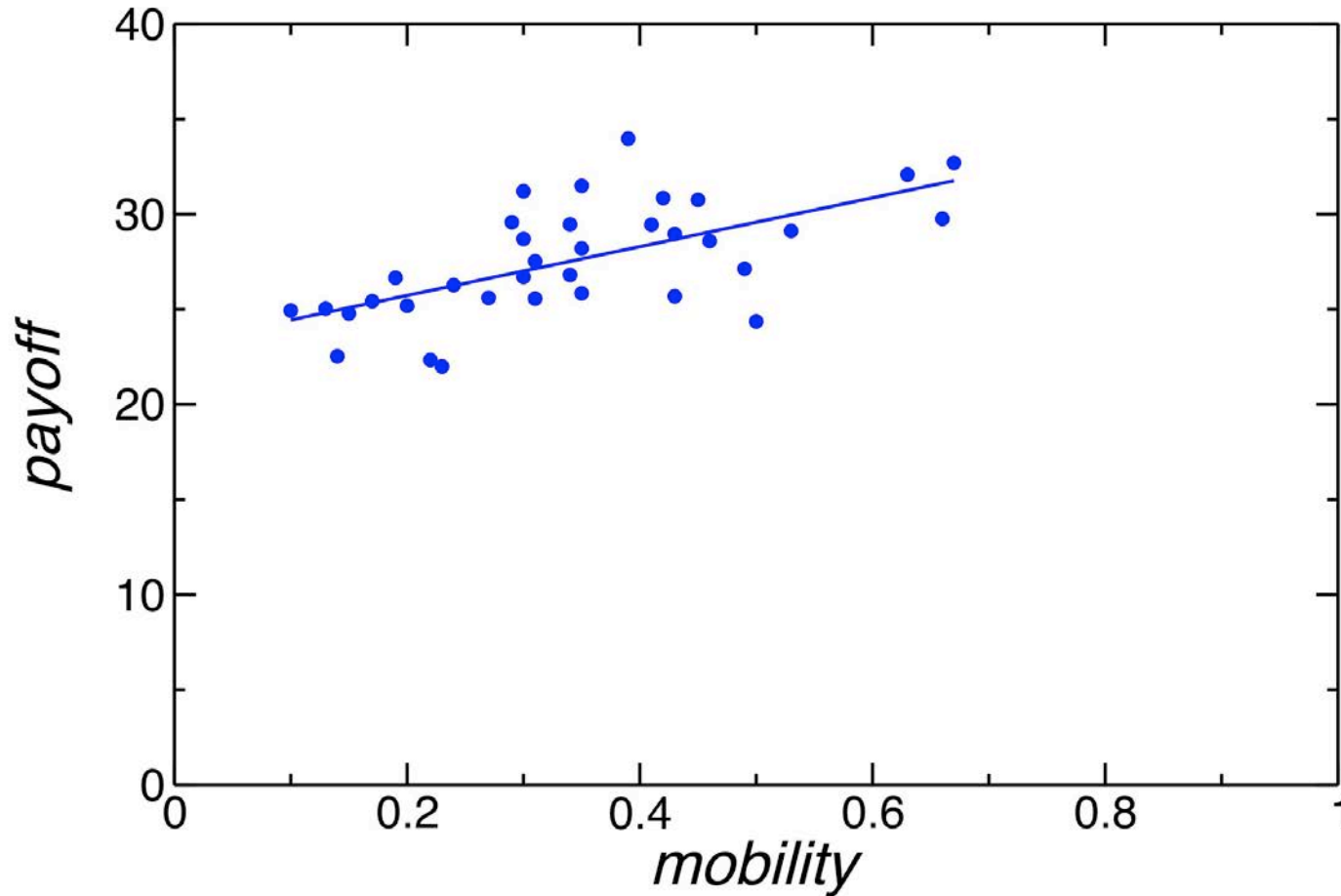
Möchten Sie gerne das Feld wechseln?

Nein
 Ja

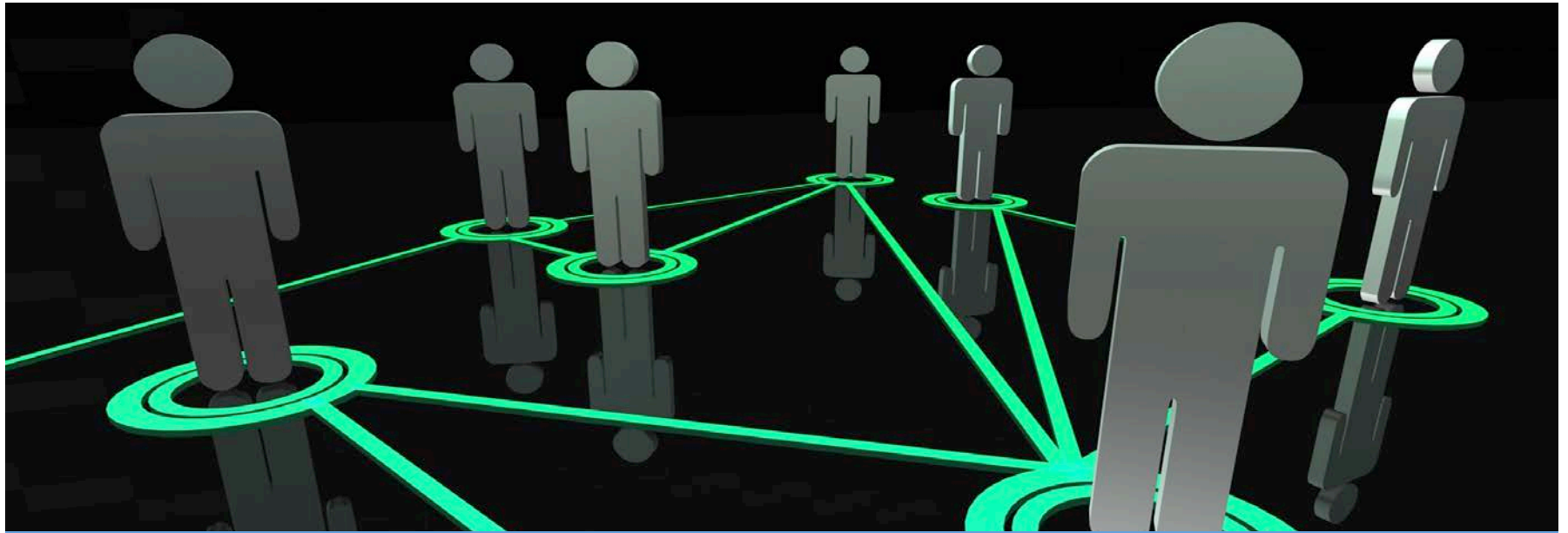
Wie entscheiden Sie sich?

Ich gebe die 20 Punkte ab.
 Ich behalte die 20 Punkte.

Payoff as Function of Mobility



Mobility is key to success!



Why Humans Are Social: The Emergence of the „Homo Socialis“

Dirk Helbing

with Thomas Grund, Christian Waloszek,
Matthias Leiss, Heinrich Nax,
and others

Evolutionary Model of Human Decision-Making

- Agents decide according to a best-response rule that strictly maximizes their utility function, given the behaviors of their interaction partners (their neighbors).
- The utility function considers not only the own payoff, but gives a certain weight to the payoff of their interaction partner(s). The weight is called the "friendliness" and set to zero for everyone at the beginning of the simulation.

Evolutionary Model of Human Decision-Making

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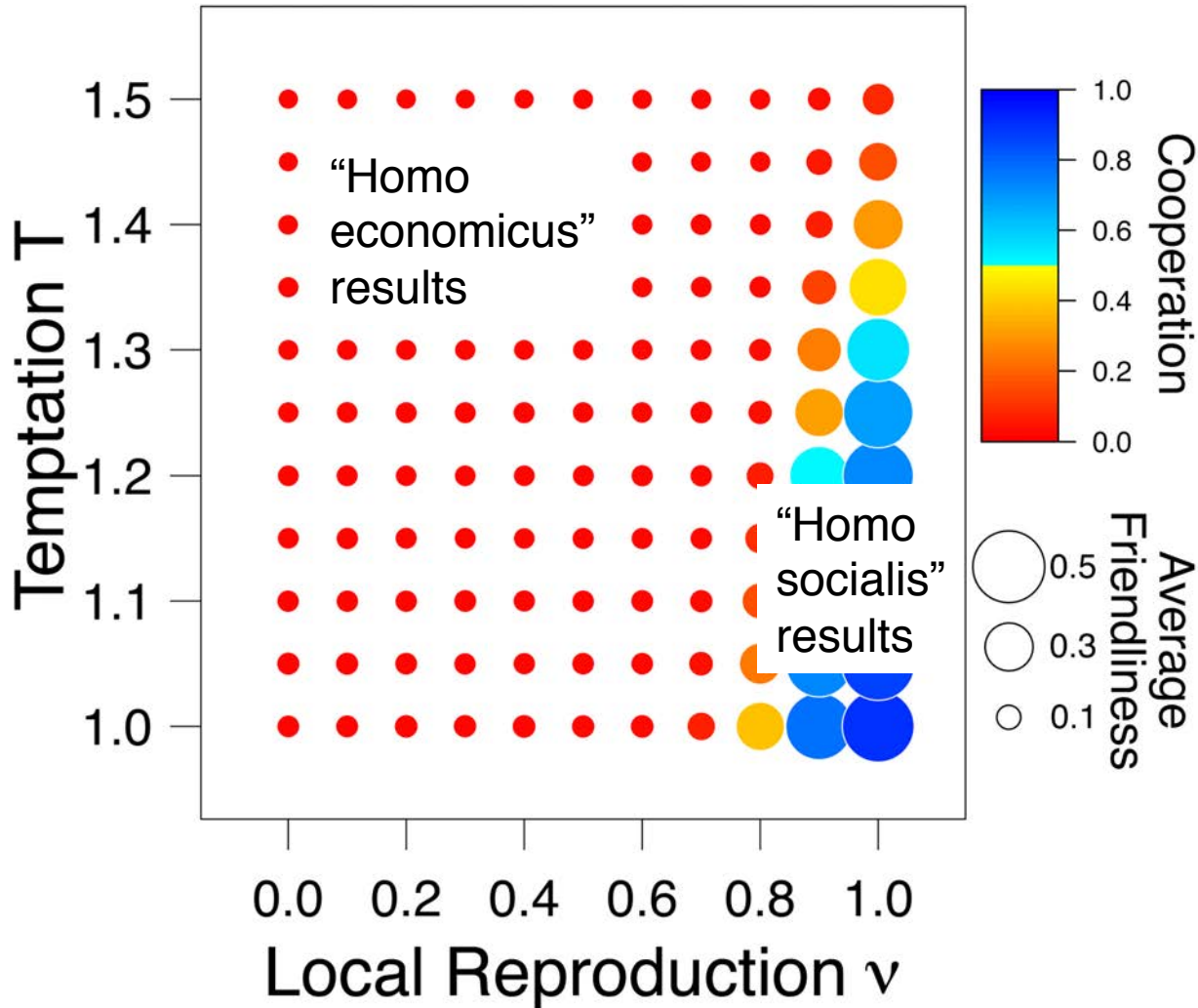
Evolutionary Model of Human Decision-Making

- Friendliness is a trait that is inherited (either genetically or by education) to offspring. The likelihood to have an offspring increases exclusively with the own payoff, not the utility function. The payoff is assumed to be zero, when a friendly agent is exploited by all neighbors (i.e. if they all defect). Therefore, such agents will never have any offspring.
- The inherited friendliness value tends to be that of the parent. There is also a certain mutation rate, but it does not promote friendliness. (In the simulation results discussed here, mutations were specified such that they imply an average friendliness of 0.2, which cannot explain the typically observed value of 0.4.)

Evolutionary Model of Human Decision-Making

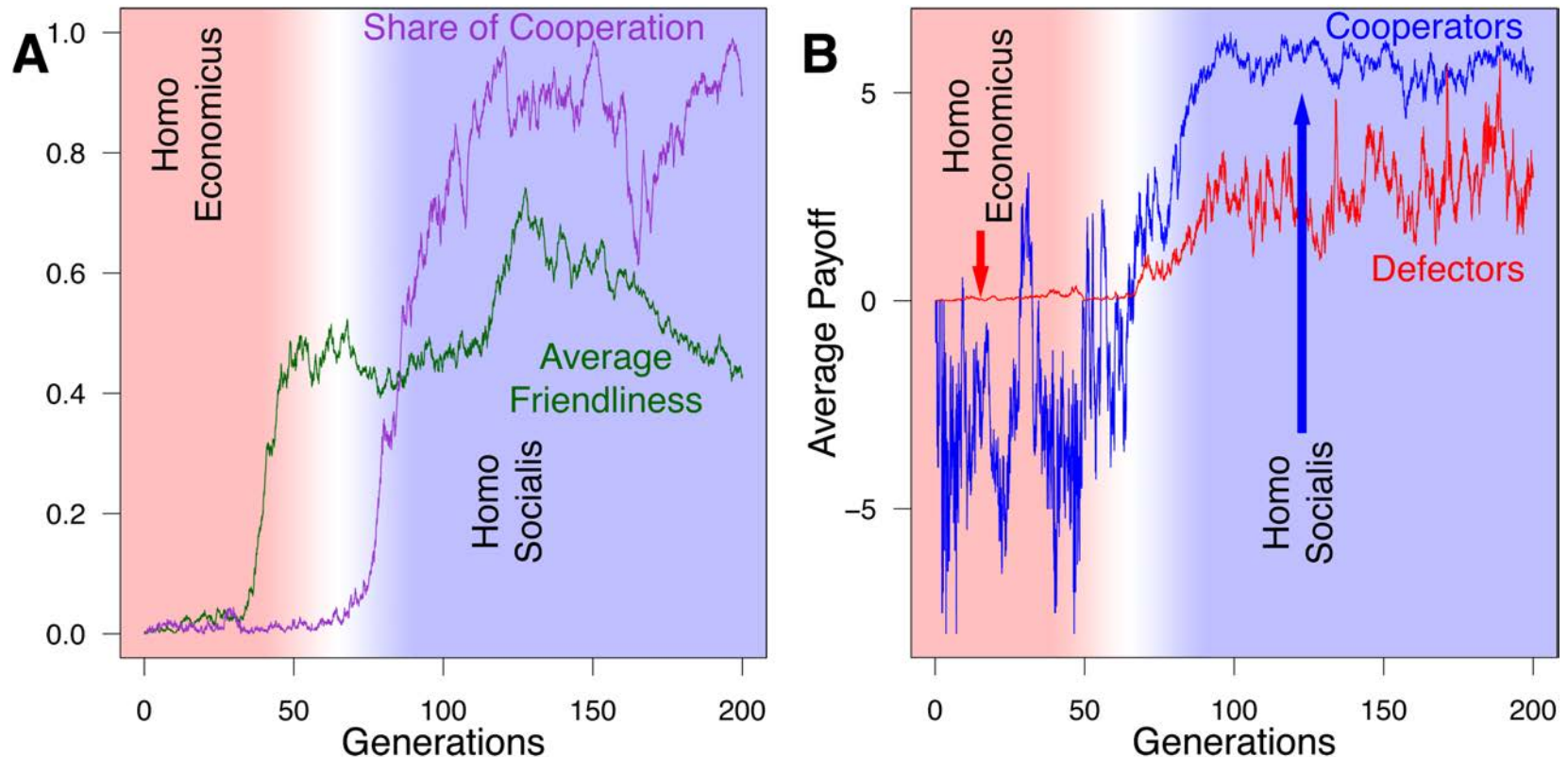
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Homo Economicus vs. Homo Socialis



Surprisingly, evolution has made (many of) us other-regarding. It's the reason for our superior position in the animal kingdom and for the existence of our society.

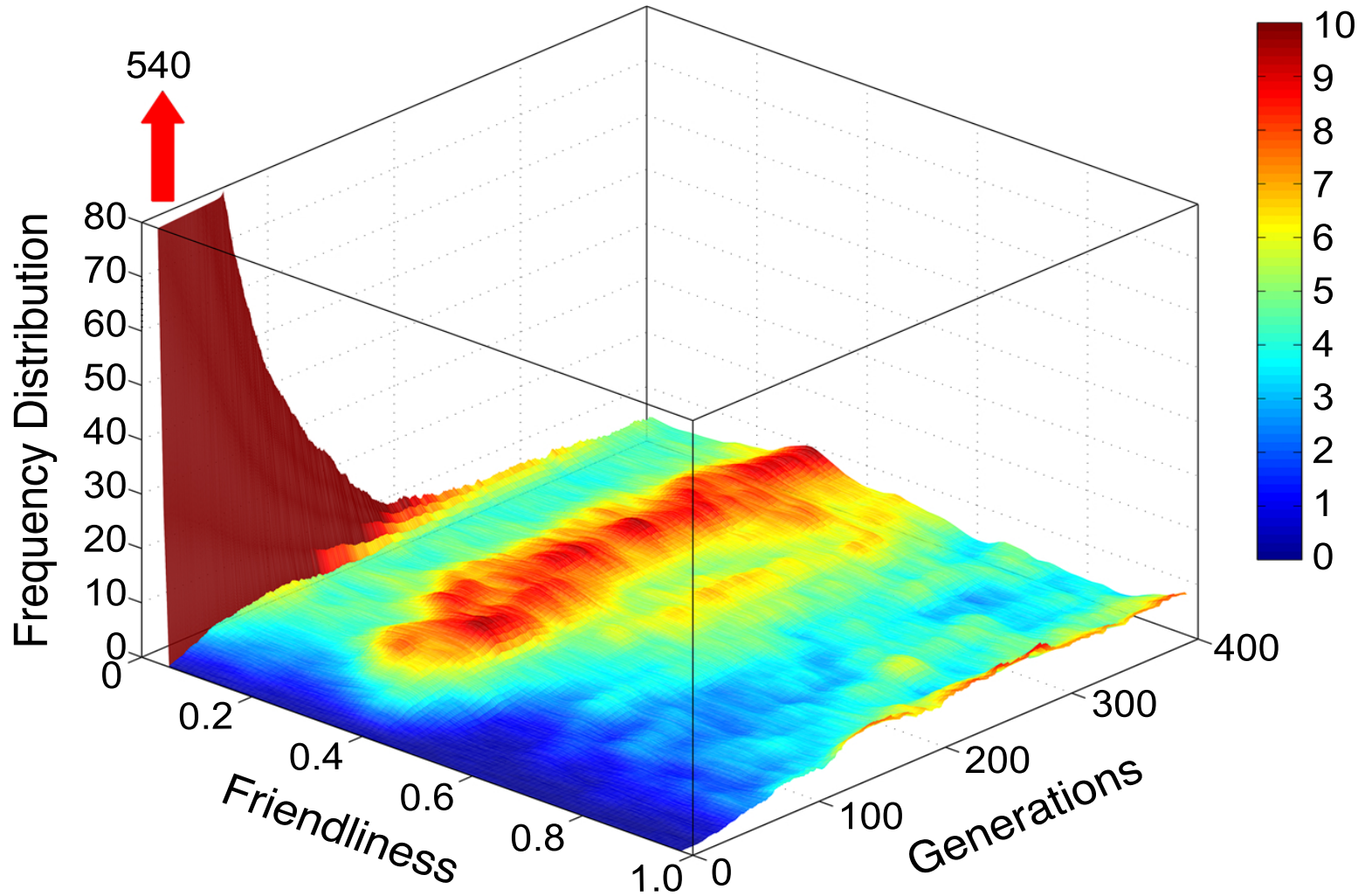
Emergence of the Homo Socialis



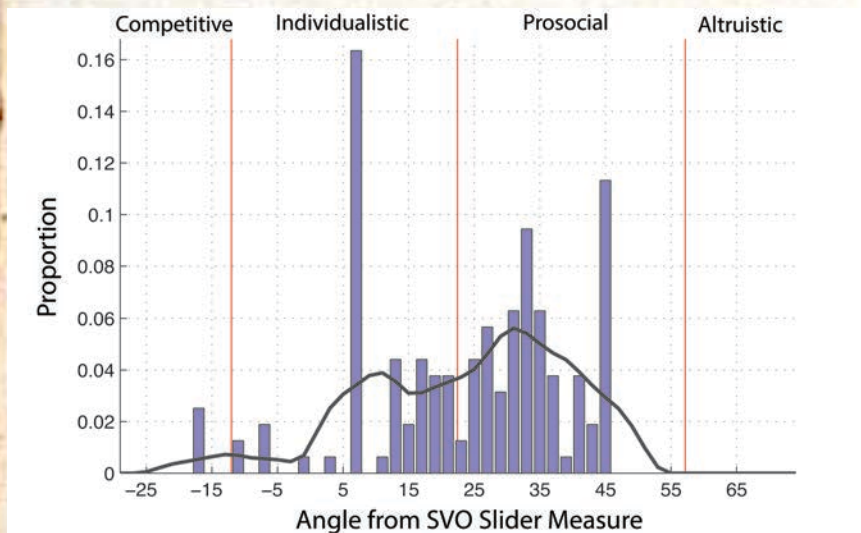
The “homo socialis” is conditionally cooperative, takes self-determined but other-regarding decisions (considering the impact on others).

This implies interdependent decisions, “networked minds”.

Distribution of Social Preferences („Friendliness“)



“How ever selfish man may be supposed, there are evidently some principles in his nature, which interest him in the fortune of others, and render their happiness necessary to him, though he derives nothing from it.”



R.O. Murphy, K.A. Ackermann, M.J.J. Handgraaf (2011) *Judgment and Decision Making* 6(8), 771–781.

THE
THEORY
OF
MORAL SENTIMENTS.

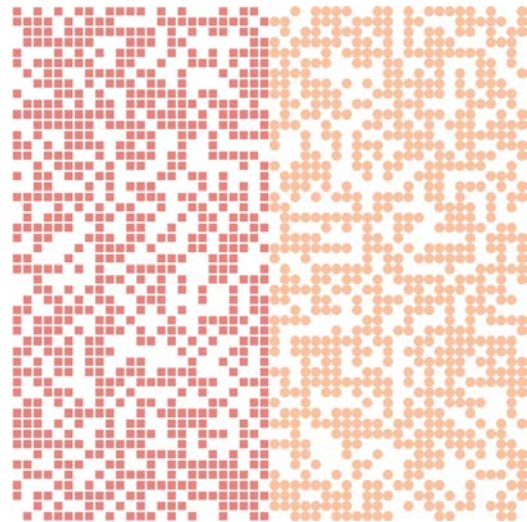
By ADAM SMITH,
PROFESSOR of MORAL PHILOSOPHY in the
University of GLASGOW.



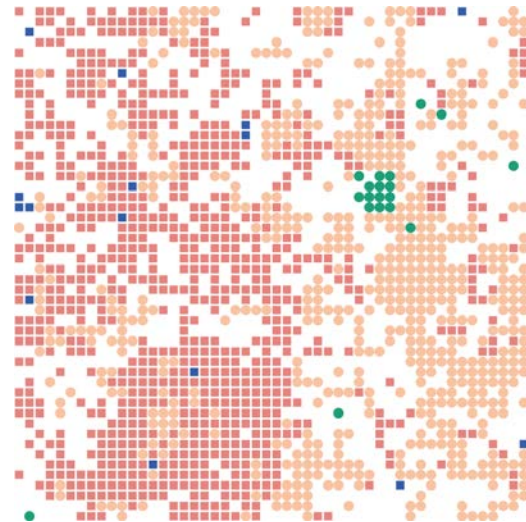
LONDON:
Printed for A. MILLAR, in the STRAND;
And A. KINCAID and J. BELL, in EDINBURGH.
M DCC LIX.

Cooperation between Strangers

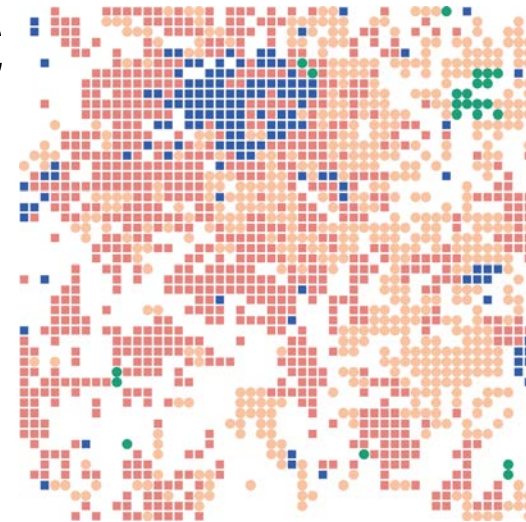
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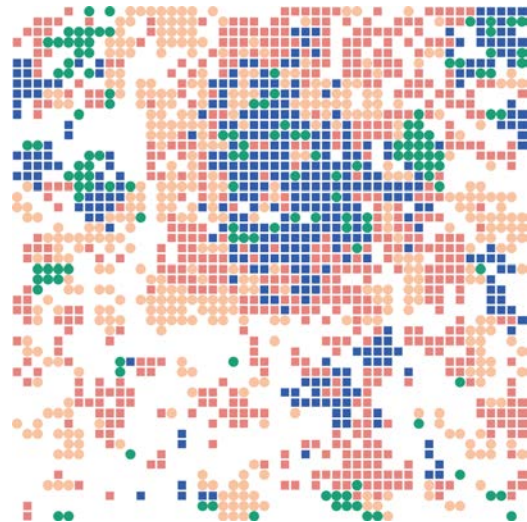
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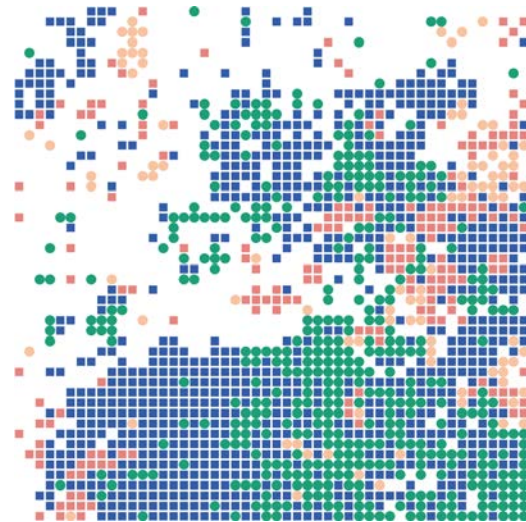
C



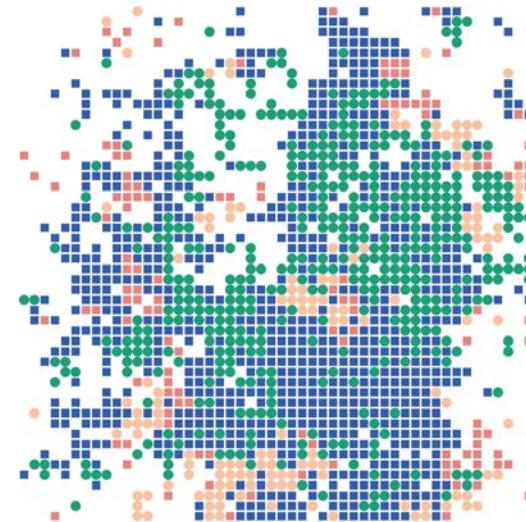
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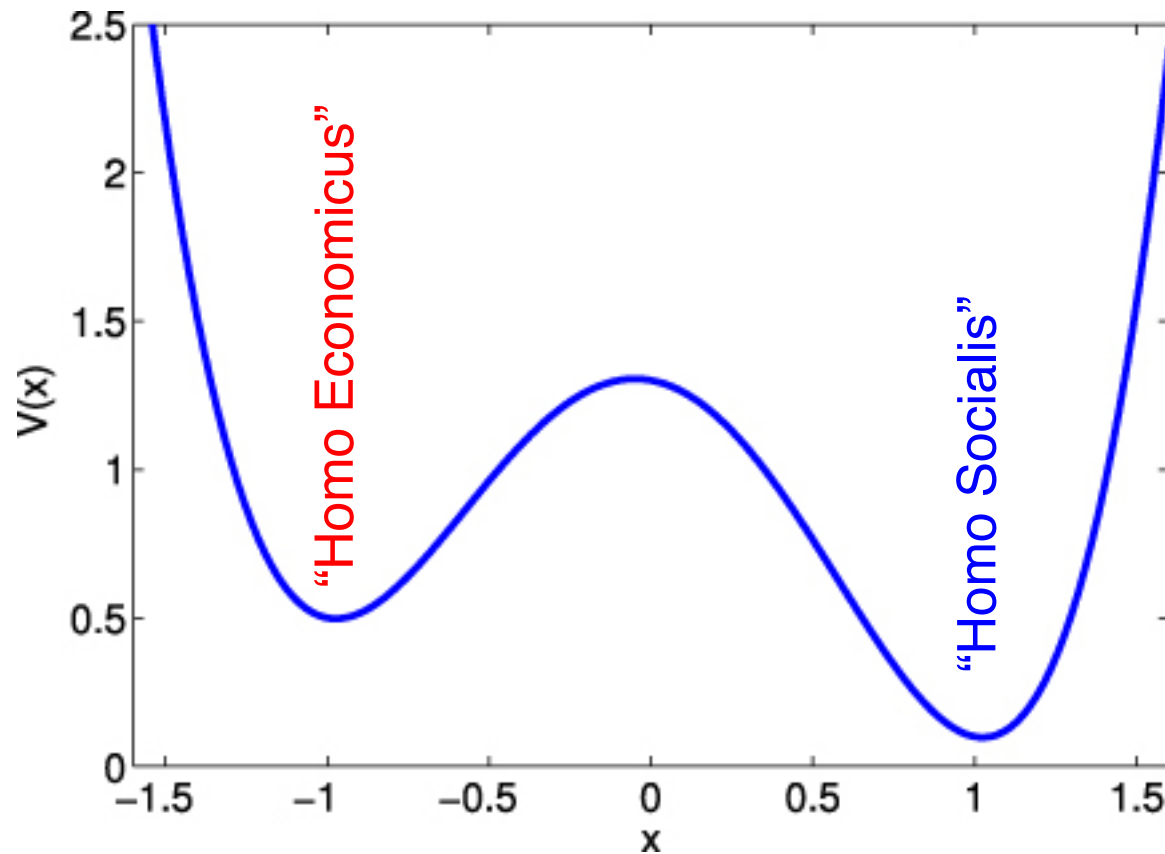
E



F



The „Homo Socialis“ Cannot Be Understood as a Small Deviation from the „Homo Economicus“, Which Can Be Approximated by Him.

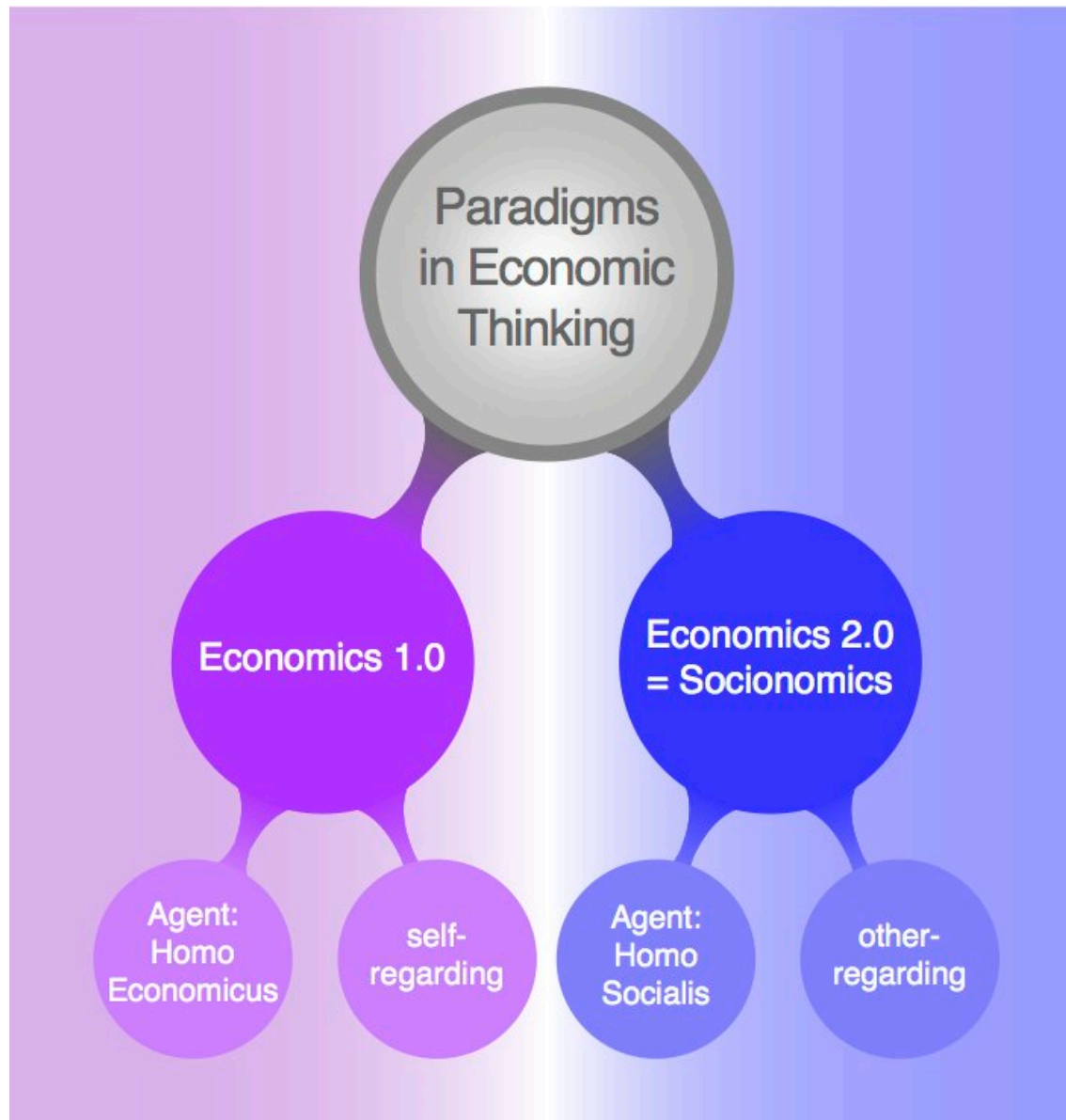


Statistically independent decisions of the „homo economicus“ may be handled with standard econometric methods.

Interdependent decisions of the „homo socialis“ require a complexity science description.

Therefore, it's wrong to assume that other-regarding preferences would not change rational choice theory. But it can be extended by considering complex dynamics.

New Economic Thinking



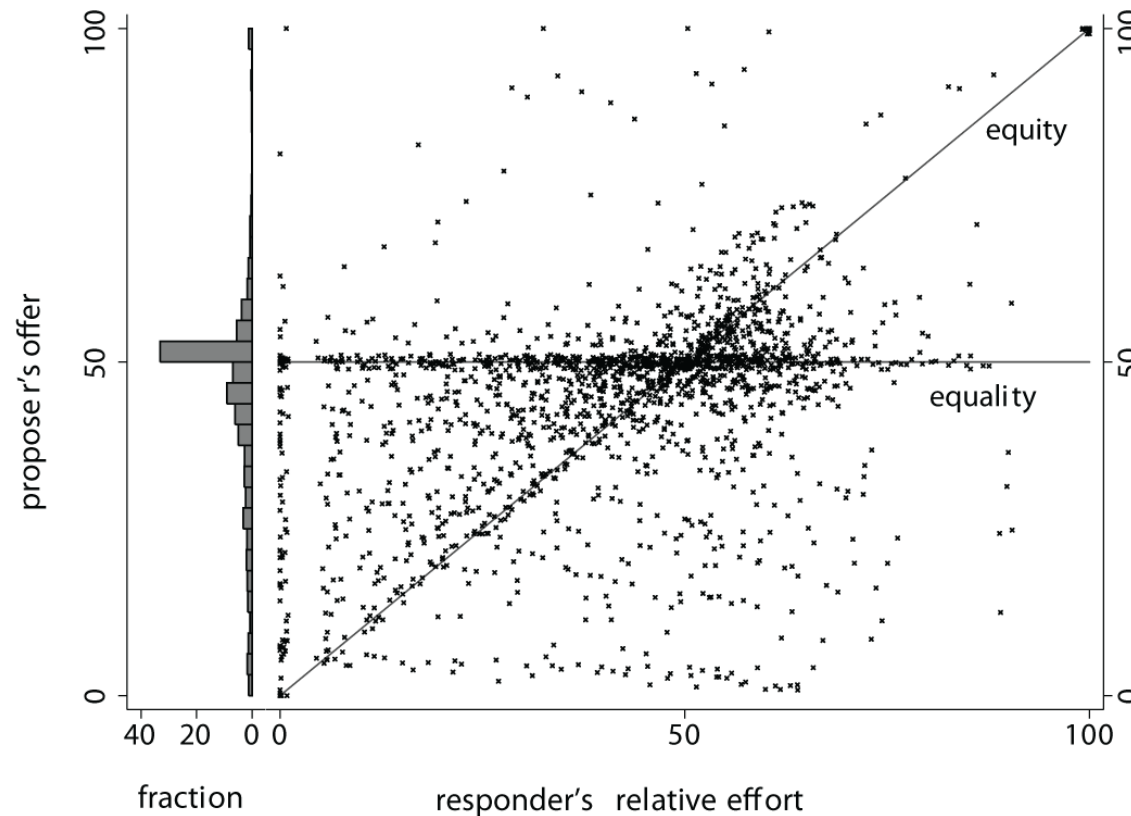


Modeling the Emergence of Social Norms when Preferences are Incompatible

Dirk Helbing

with Michael Mäs, Anders Johansson,
Heiko Rauhut, Fabian Winter,
and others

Conflict between Individuals with Equity and Equality Preferences



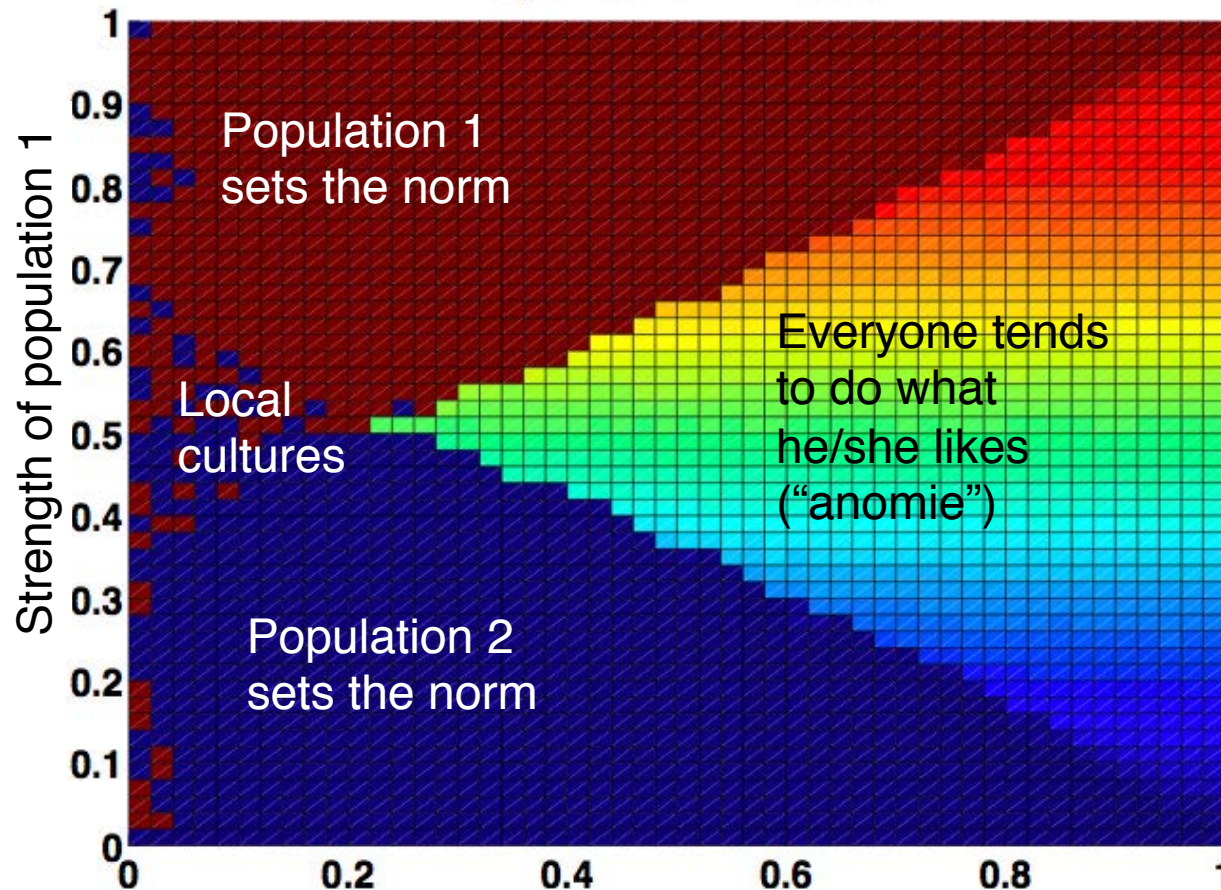
Results of an Ultimatum Game Experiment

Joint work with Fabian Winter and Heiko Rauhut

Emergence of Social Norms: Theoretical Results

$\epsilon = 0.01$, Interaction Partner = 1, $p_0 = p_1 = 0.5$

Proportional Imitation



Computer simulations:

Red = individuals preferring behavior 1

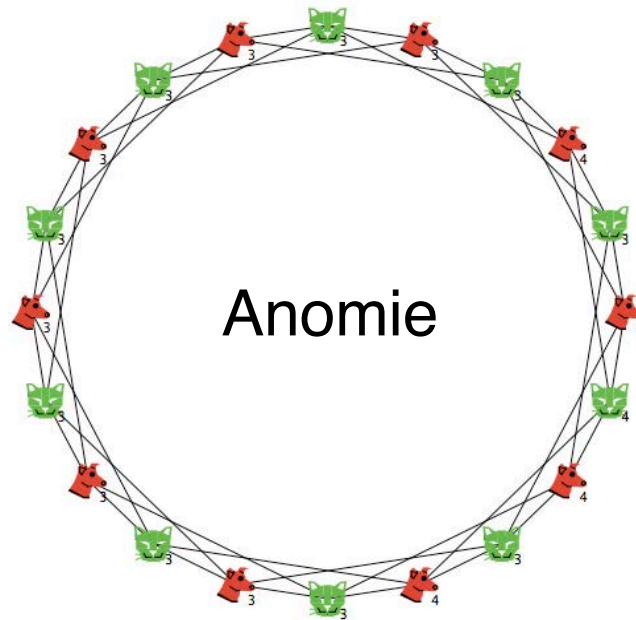
Yellow = individuals adjusting to behavior 1

Blue = individuals preferring behavior 2

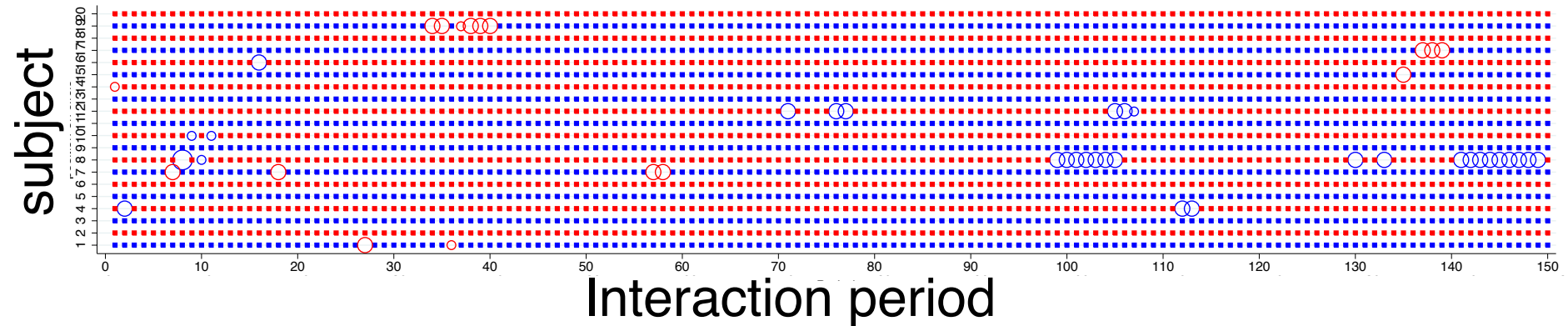
Green = individuals adjusting to behavior 2

Reward of showing preferred behavior / Reward of conforming

Occurrence of Anomie: Experimental Results

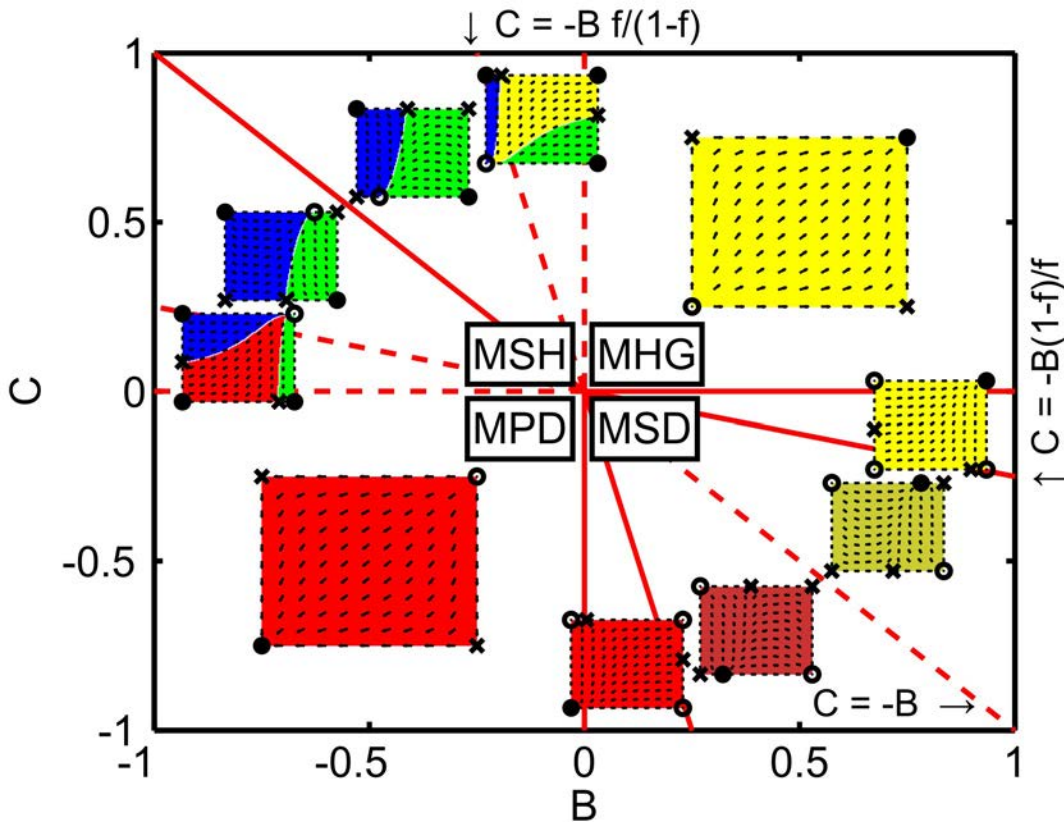


Results from the lab: anomie



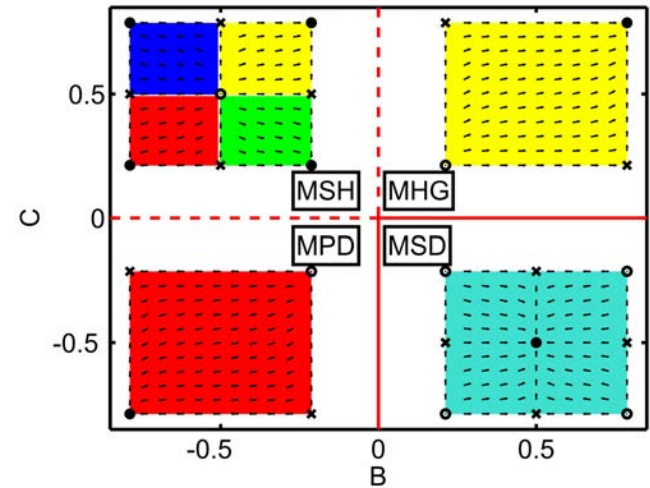
2 Populations with Incompatible Preferences

with interactions and self-interactions

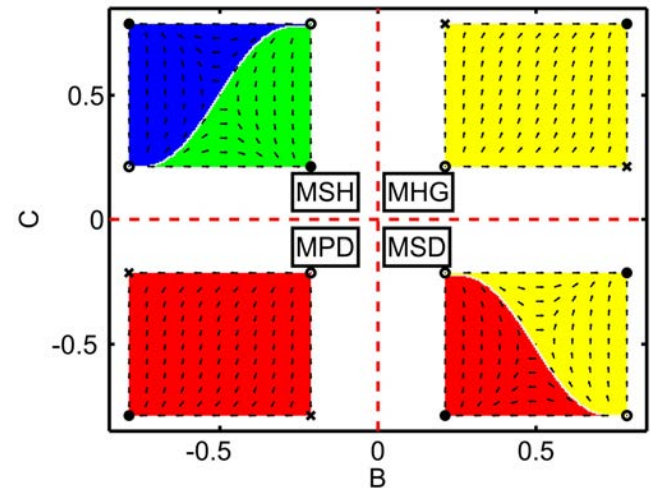


MSH = multi-population stag hunt game
 MPD = multi-population prisoner's dilemma
 MHG = multi-population harmony game
 MSD = multi-population snowdrift game

without interactions



without self-interactions





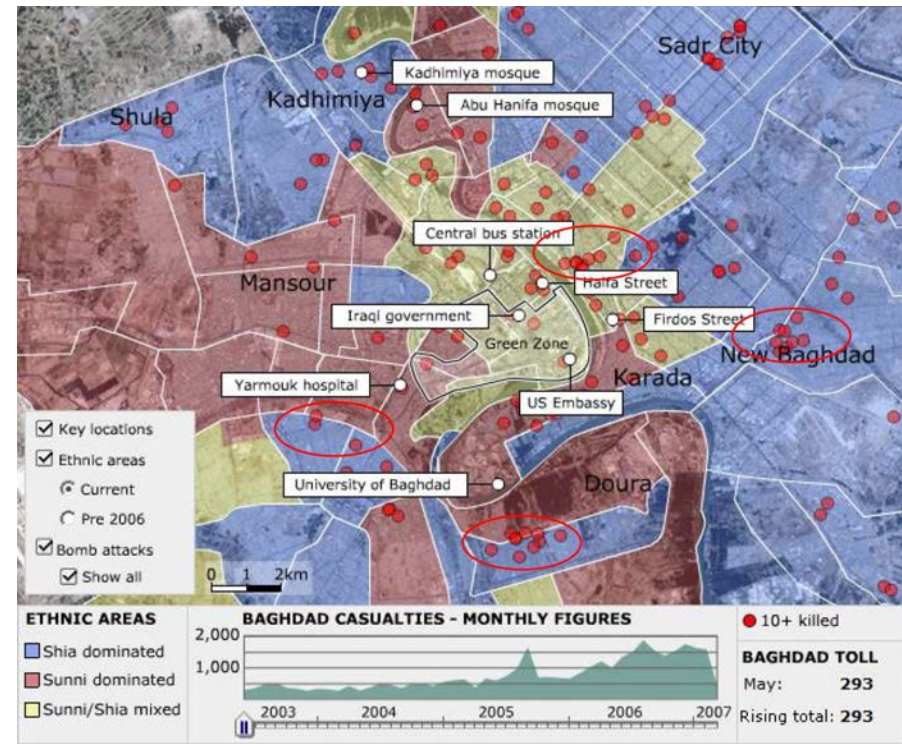
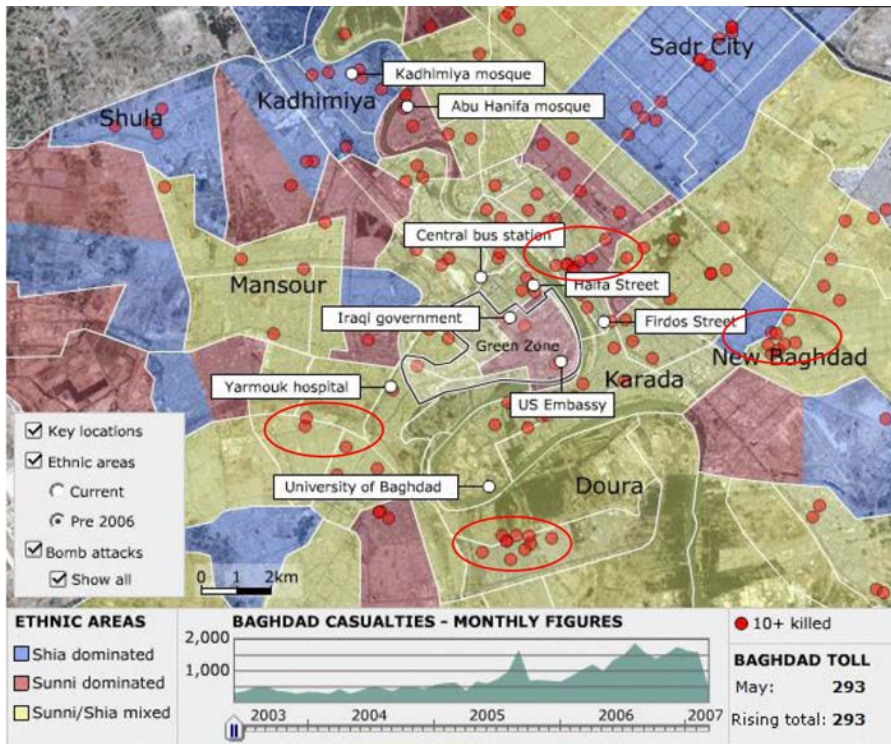
Studying Intercultural and International Conflict

Dirk Helbing

with Karsten Donnay, Thomas Chadefaux,
Ravi Bhavnani, Dan Miodownik,
and others

Interrelation of Spatial Interaction, Conflict, and Migration

Source: BBC



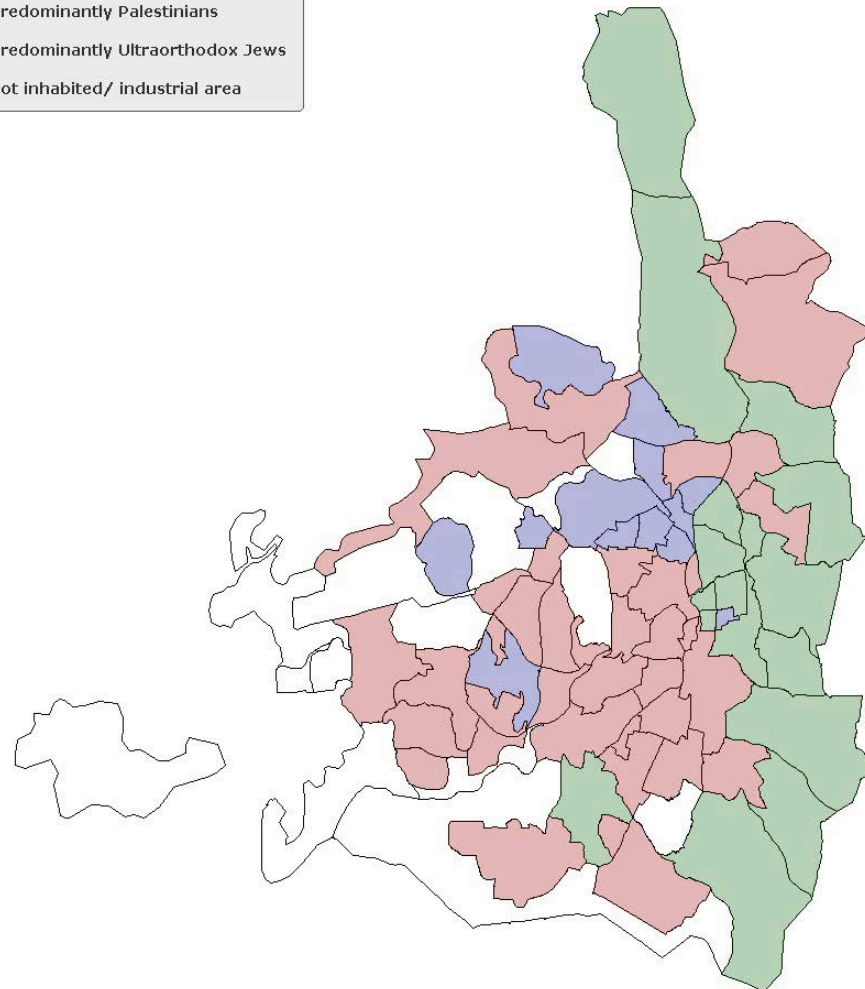
Ethnic areas and bomb attacks before 2006 Ethnic areas and bomb attacks after 2006

Conflict occurs primarily at boundaries between areas with different ethnic fractions. Mixed areas shrink.

Conflict in the Middle East

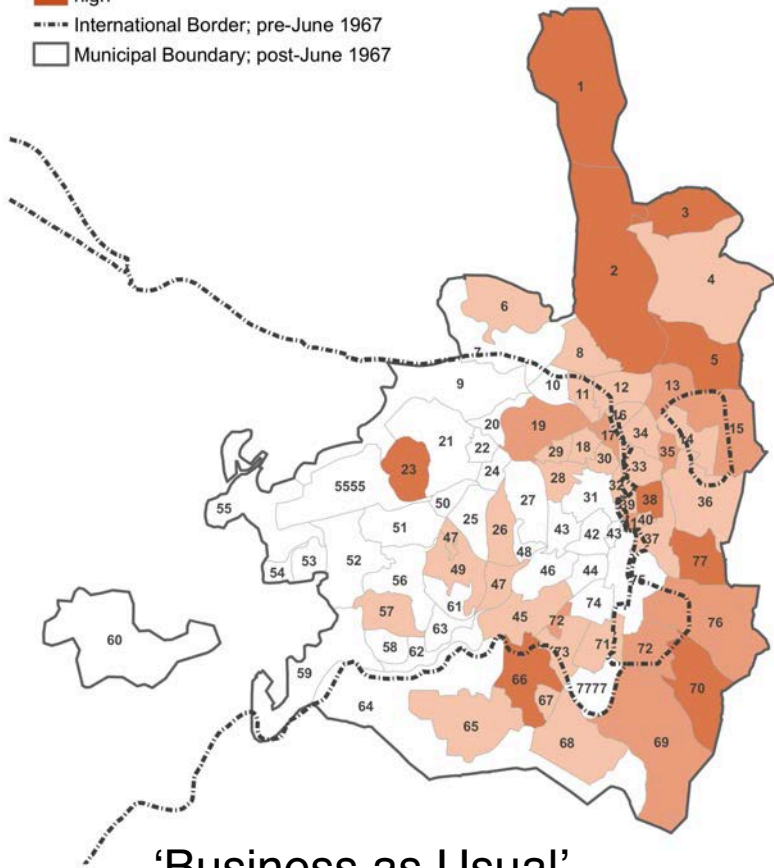
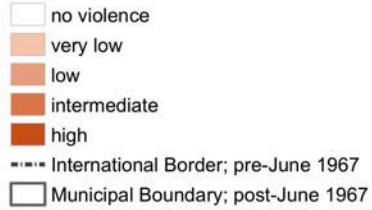


Jan. 2005



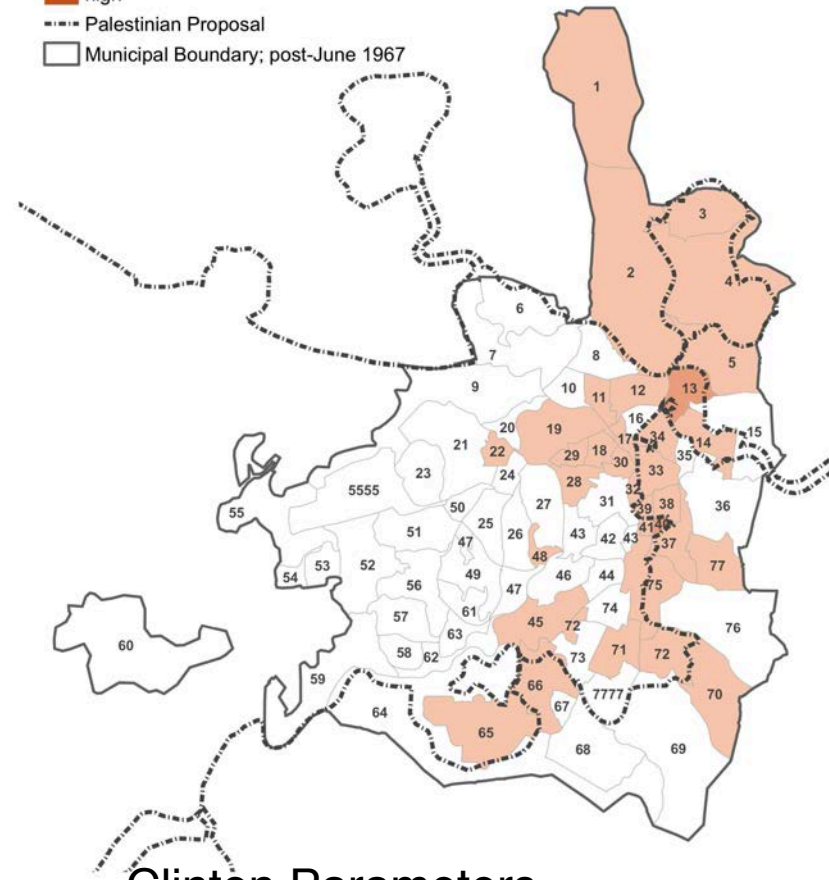
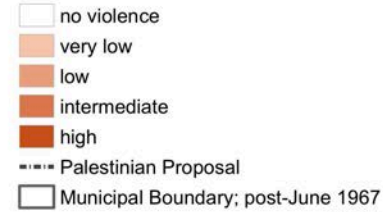
Conflict in the Middle East: Possible Future Scenarios

Levels of Violence



'Business as Usual'

Levels of Violence



Clinton Parameters

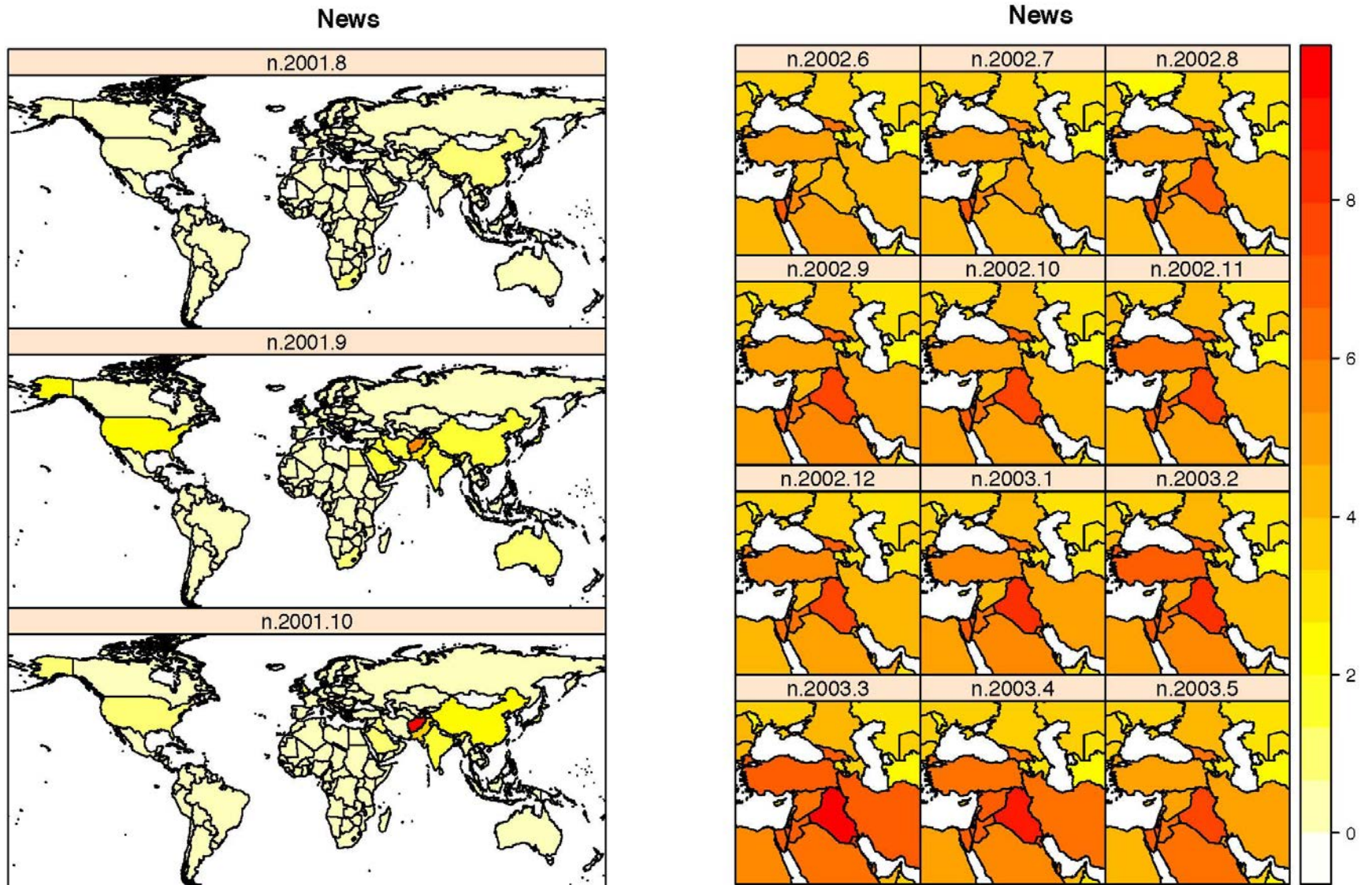


Understanding Social Dynamics by Analyzing Human Activity Data

Dirk Helbing

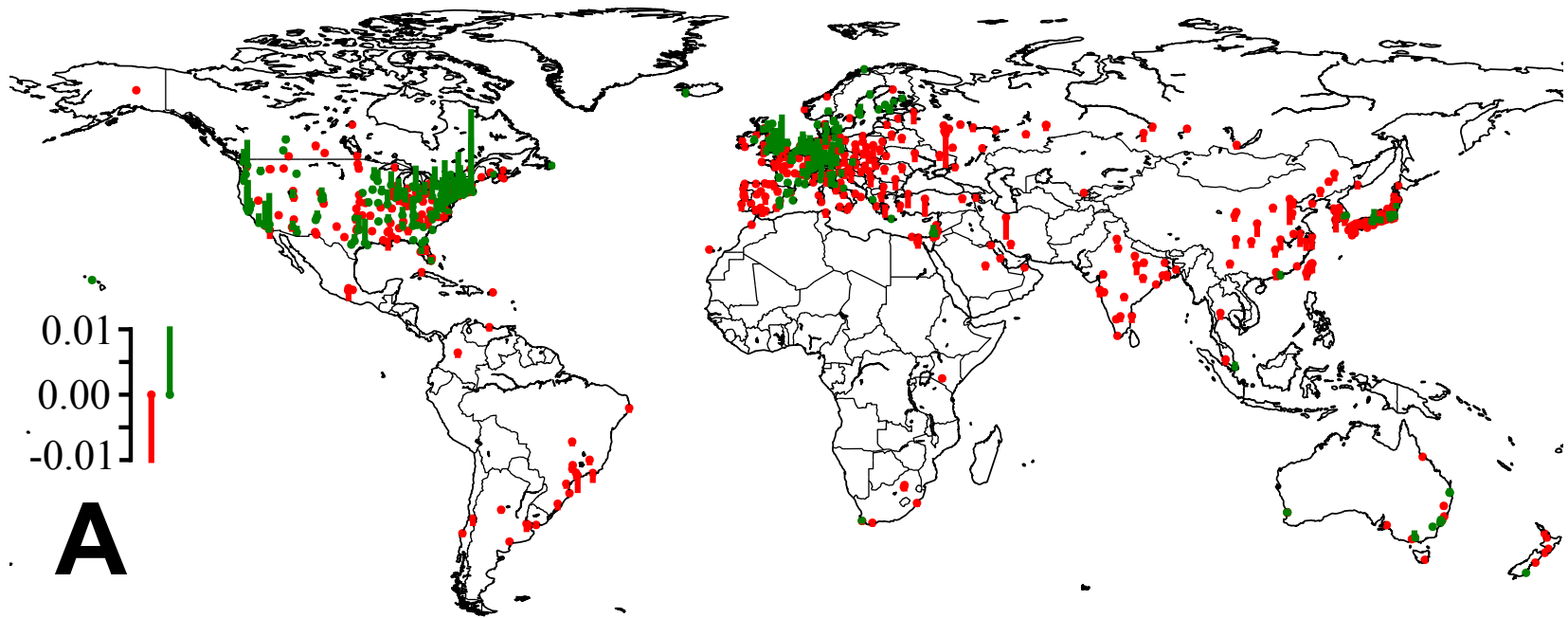
with Dirk Brockmann, Maximilian Schich,
Laszlo Barabasi, Bogdan State,
and others

Measurement and Prediction of Conflict Probability

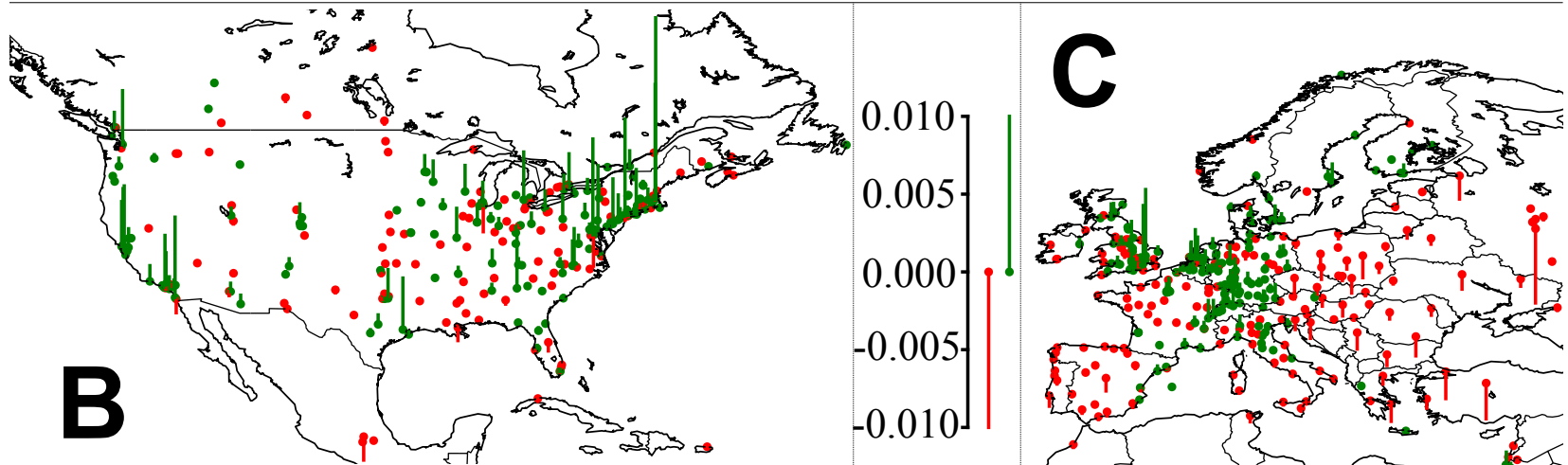


Joint work of Thomas Chadeaux and Dirk Helbing

Global Knowledge Production and Consumption



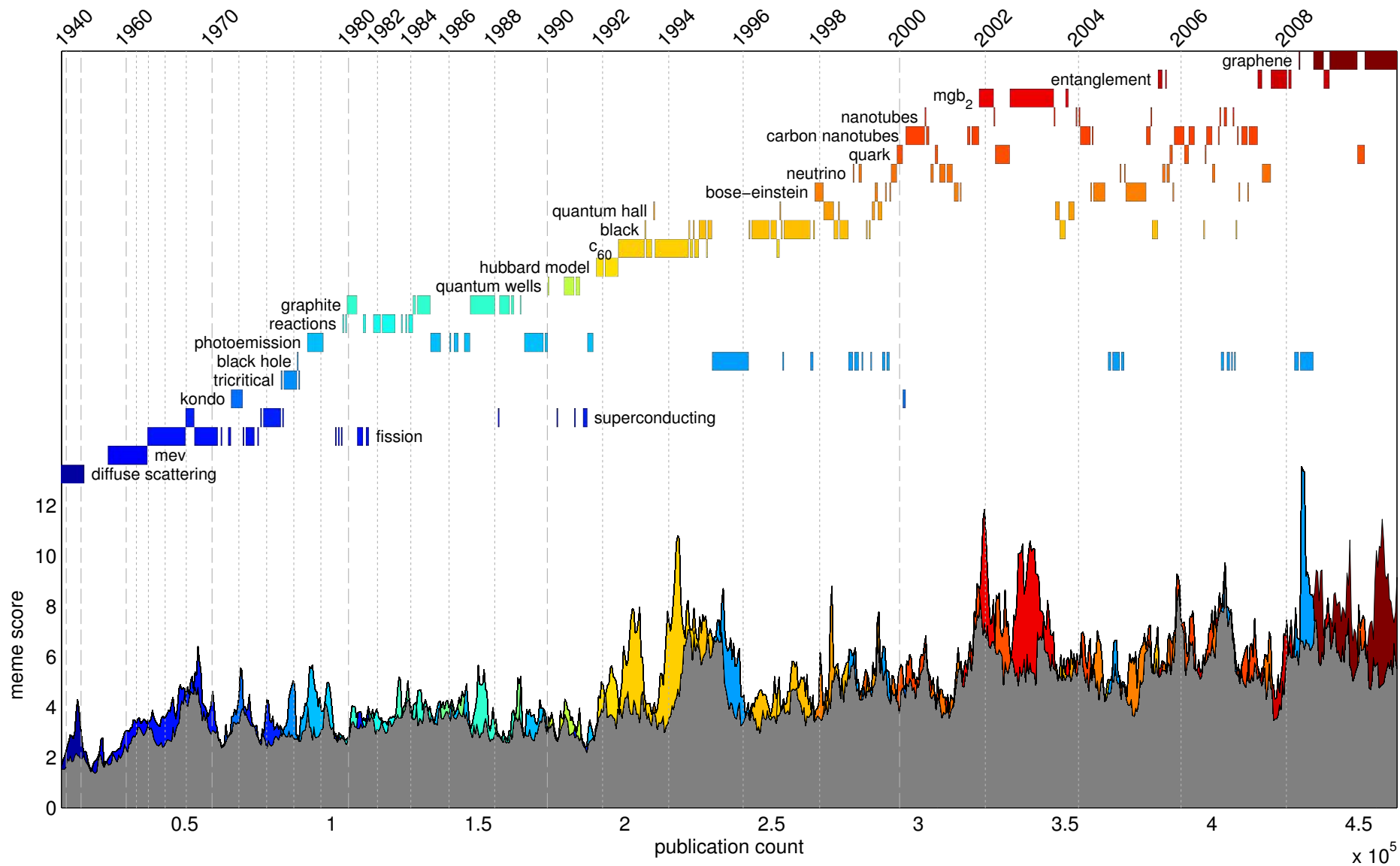
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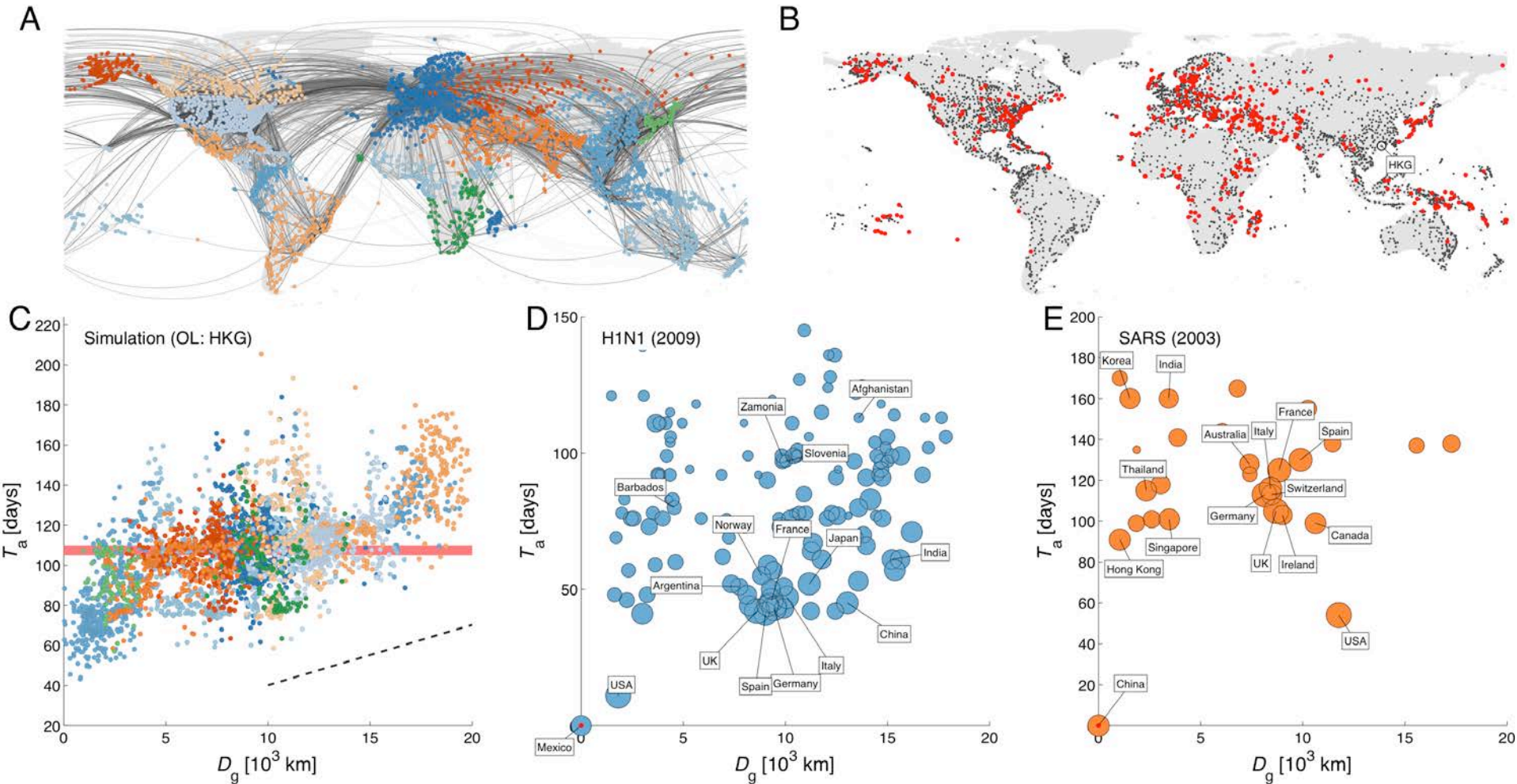
B

C

Measuring Physics Memes

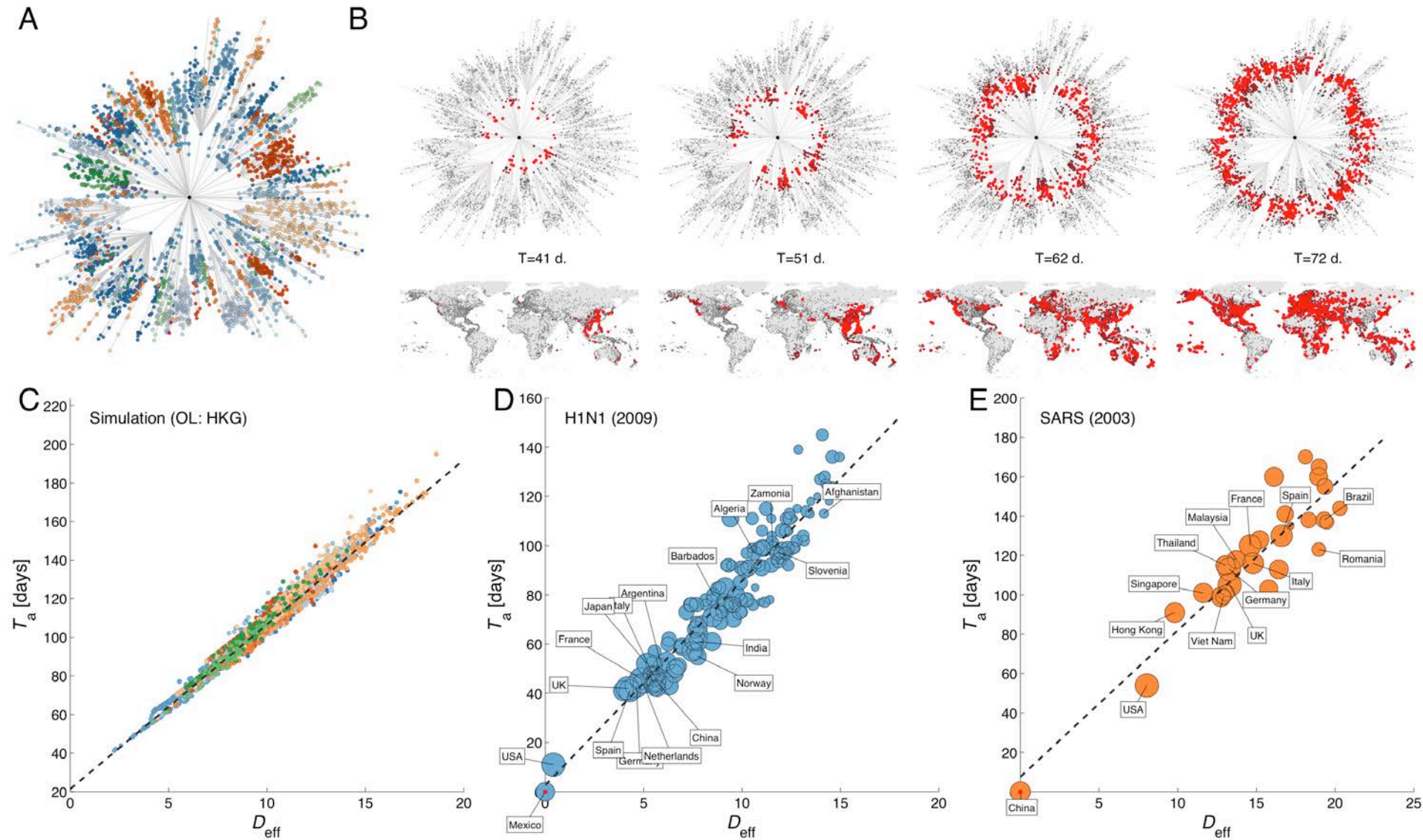


Complexity of Epidemic Spreading



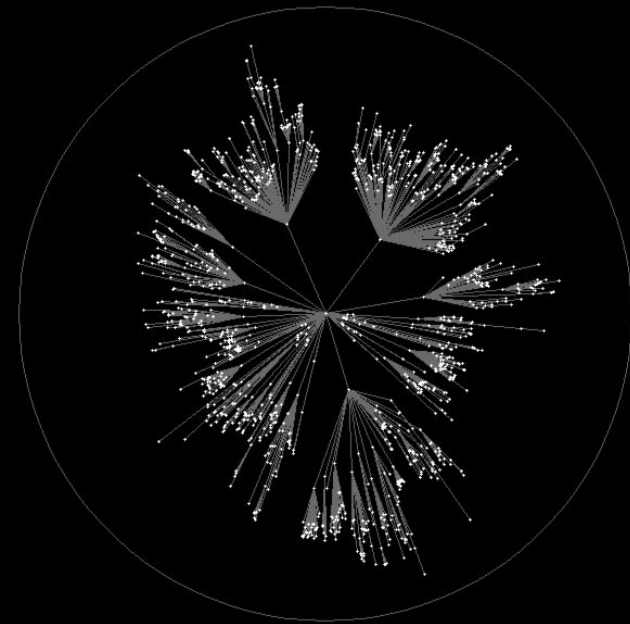
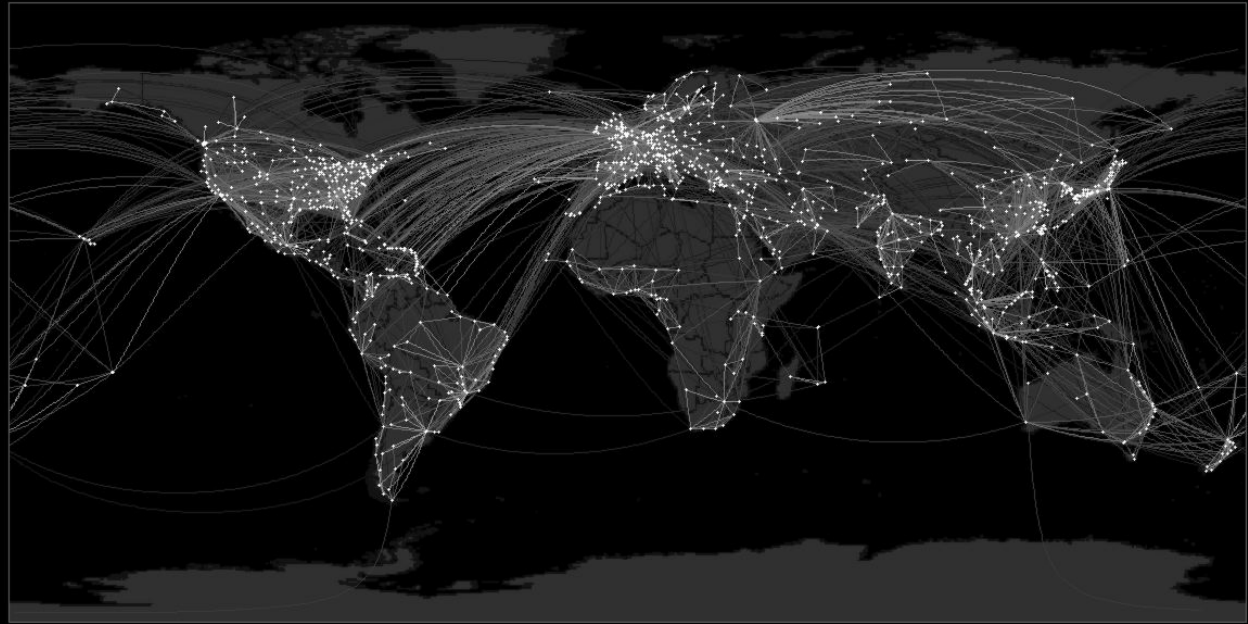
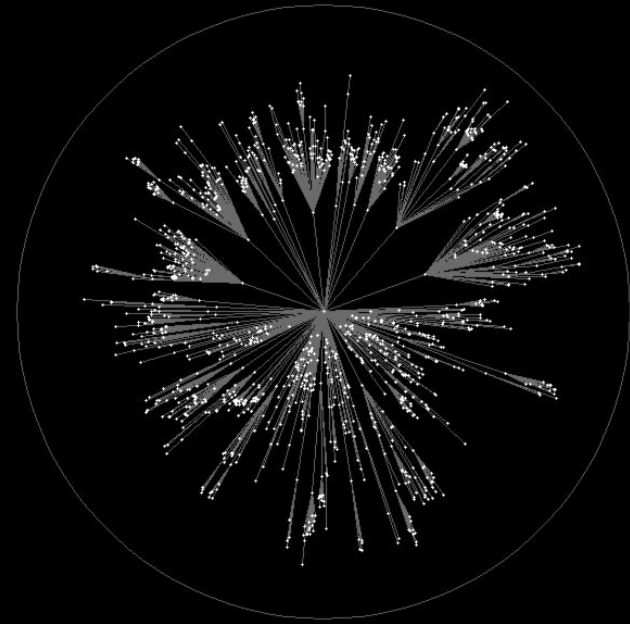
Dirk Brockmann and DH, Science (2013)

Predictability of Epidemic Spreading



Dirk Brockmann and DH, Science (2013)

Epidemic Spreading



Source: Dirk Brockmann

Countering Pandemics



CHARTING THE NEXT PANDEMIC



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Dirk Helbing (ETH Zurich)

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