

# **Game Theory, Internet and the Web**

## **A new Science?**

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(google: Paul Spirakis)

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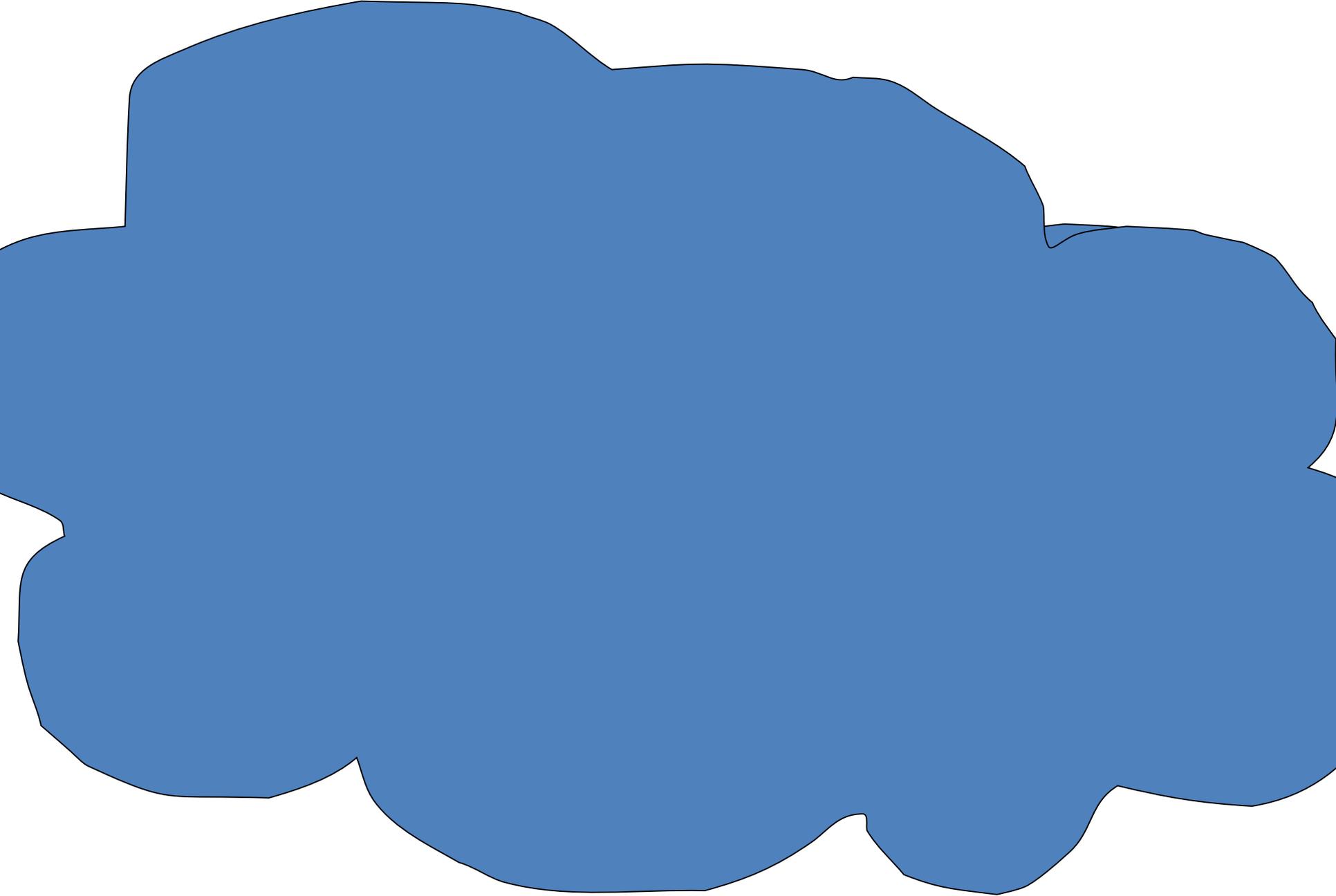
(with help from C. H. Papadimitriou, Berkeley)

- Main Goal of Computer Science (1950-2000):

*To investigate the capabilities and limits of the Computing Model of von Neumann – Turing (and its software)*

(Math Tools: Logic, Combinatorics, Automata )

- What is the goal of Computer Science for the 21<sup>st</sup> century?



# The Internet and the Web

- **Built, operated and used by a variety of entities with diverse interests.**

- Not yet understood deeply

“The Web is a huge arena of competition and cooperation between many logical entities with selfish interests” (C.H. Papadimitriou)

**New Tool:** Math Foundations of Economics,  
Game Theory

# Game Theory

Game = Any interaction among rational and logical entities each of which may have different motives and goals.

Game  $\Gamma = (N, \{S_i\}, \{u_i\})$

$N$  = Set of “players”

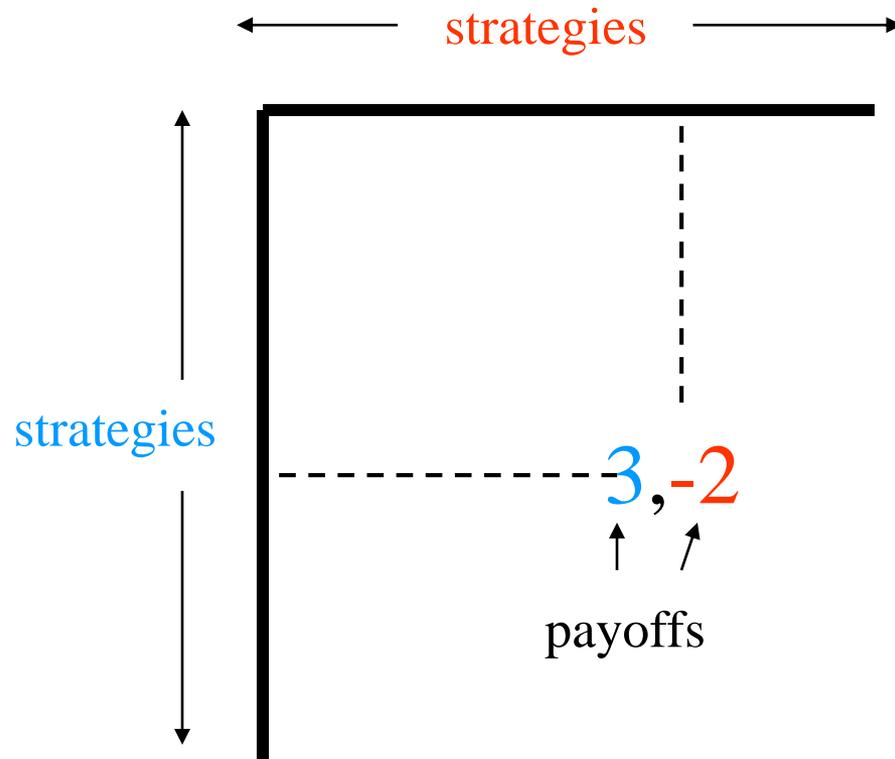
$S_i$  = Set of pure strategics of player  $i$

$u_i: X_{S_i} \rightarrow R$  = The utility function of player  $i$

(Expected Utility Theorem of Von Neumann & Morgenstern)

- A game is a **system** of rational and logical entities in interaction
- **Selfish entities:** Each of them has a possibly different utility function (and wants to maximize it)  
“People are expected utility maximizers”
- Such systems are very different from the “usual”

# Game Theory



Similarly for many players

e.g.

This for that

1,-1	-1,1
-1,1	1,-1

Prisoner's dilemma

3,3	0,4
4,0	1,1

# Rational Behaviour

- Dominant Strategies (but they do not always exist)
- Nash Equilibria (mutual best response)  
Each player will not benefit if she deviates unilaterally
- Mixed Strategies allowed (i.e. prob. distributions on the pure strategies of each player).

# John Forbes Nash, Jr.

(A beautiful mind)

Theorem [Nash, 1952]

Every finite game has at least one  
Nash Equilibrium

# The beauty of Mathematics

Discrete Math (Graphs)



Sperner Lemma (Combinatorics)



Fixpoint Theorem of Brower (Analysis)



Kakutani's Theorem  $\Rightarrow$  Market Equilibria

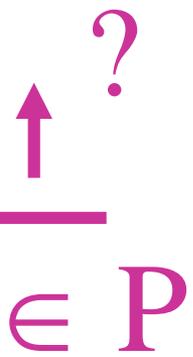


Nash's Theorem



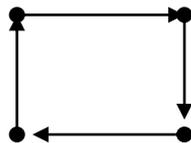
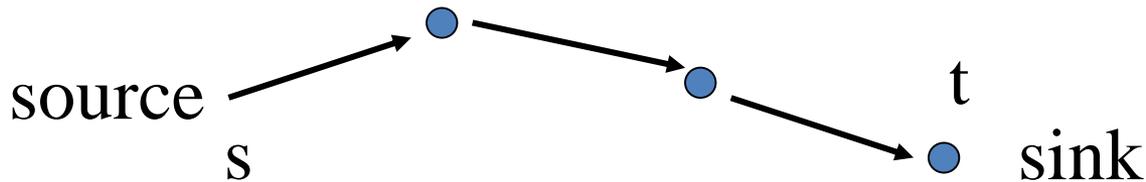
zero sum games

duality, linear programming



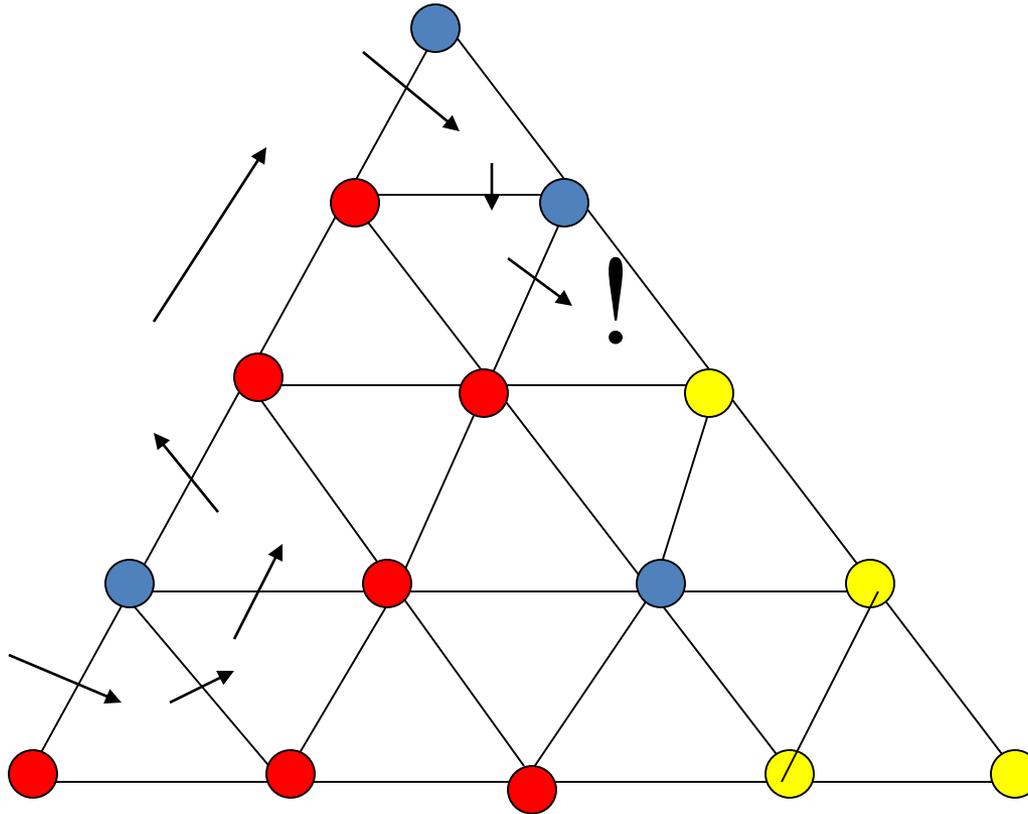
# Discrete Mathematics

«Any directed graph with indegrees and outdegrees at most 1, if it has a **source** then it has a **sink**»



**Sperner's Lemma: Any legal coloring of a triangulated polytope contains a trichromatic triangle.**

**Proof:**



# Sperner $\Rightarrow$ Brower

**Brower's Thm:** Any continuous function from a polytope to itself has a fix point.

## Proof

Triangulate the polytope. Color the vertices according to the direction indicated by the function.

Sperner  $\Rightarrow$  There exist a triangle with “no exit”

Now make the triangulation dense

The subsequence of the centers of the Sperner triangles converges

QED

# Brower $\Rightarrow$ Nash

For each pair of mixed strategies  $x, y$  let:

$\varphi(x, y) = (x', y')$ , where  $x'$  maximizes

$$\text{off}_1(x', y) - |x - x'|^2,$$

( $\text{off}_1$  = expected payoff of player 1)

Similarly for  $y'$ .

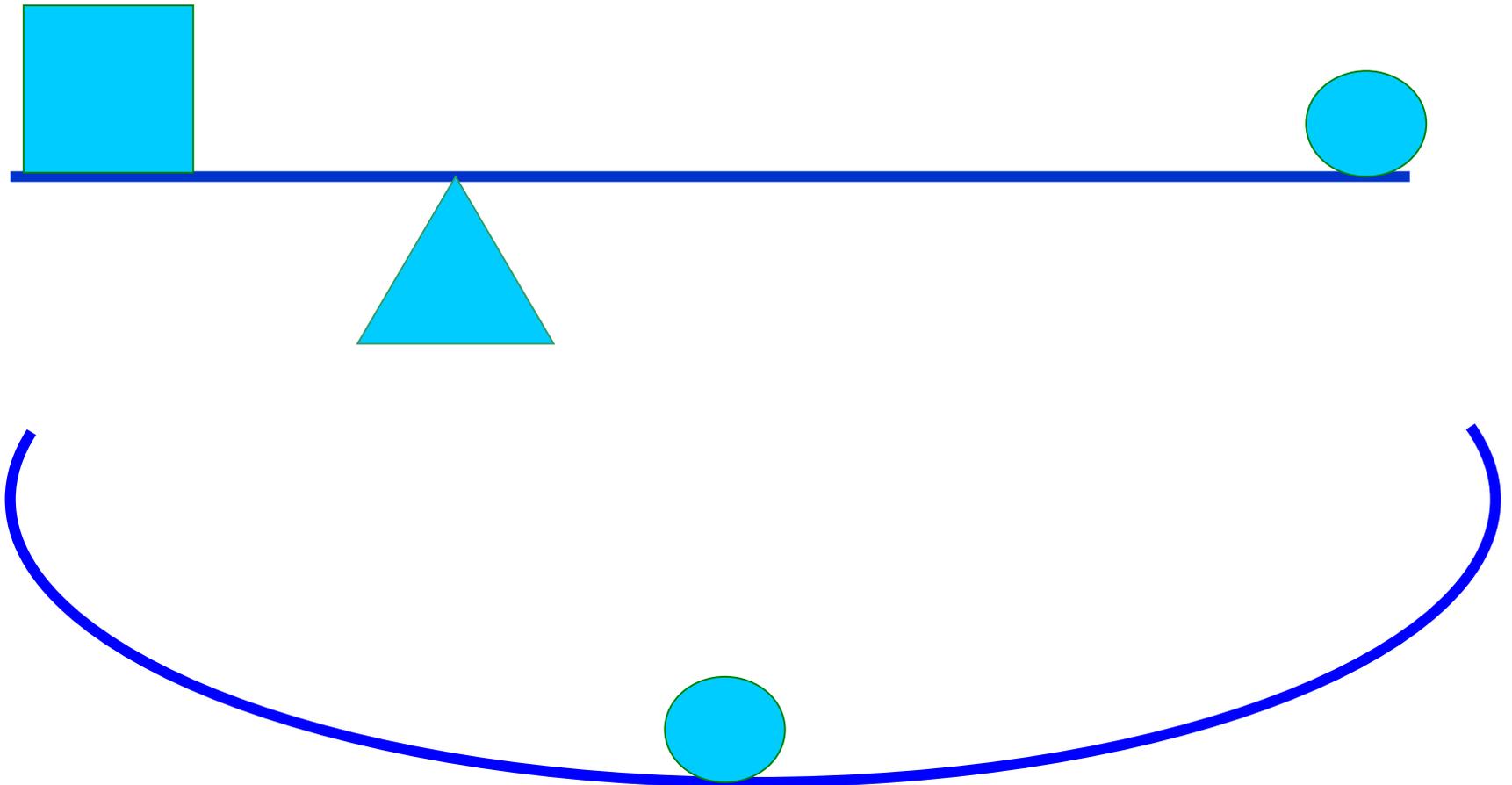
Now any Brower fixpoint is a Nash  
Equilibrium

QED

# Nash $\Rightarrow$ von Neumann

If the game is zero – sum (constant sum) then the mutual best responses are the same as a max-min pair (and due to duality, the solution of a Linear Program).

# The notion of Equilibrium is basic in many Sciences



# Some Questions

- How logical is the probabilistic play?  
(poker bluffs, tax evasion)
- Can we “learn” (or compute) an equilibrium;
- What is the best (worst) Equilibrium;

# Approximate Equilibria

- **$\epsilon$ -Nash**: Each player stays at equilibrium decision, even if she may gain at most “epsilon” by unilaterally deviating

“We don’t change our mate for a slightly better”

- Can we compute  $\epsilon$ -Nash equilibria efficiently?

BEST Poly-time result:  $\epsilon = 0.34$

[Tsaknakis, Spirakis, 07]

Sub exponential methods (Lipton, Markakis, Mehta, 03)  
(Tsaknakis, Spirakis, 10)

- Still open to go below “1/3”

# The battlefield

- The “system”
- The Web
- The terrain
- Society

## **SOCIAL COST (Function of Social happiness)**

$$SC : X C_i \rightarrow R$$

The function measures the social cost, given the choices (strategies)  $y_i$  of each player  $i$ .

## Examples of Social Cost

- Energy spent
- Max delay in streets
- Political cost for the country / EU given the decisions of the leaders.

**Altruist:** A player whose utility function “agrees” with the social cost function

If God would order everybody how to decide then we would get an Optimal Social Cost, OPT

- But, actually, the “system” reaches an equilibrium  $P$
- How far is  $SC(p)$  from OPT?

(Usually OPT is not even an equilibrium!)

## The Price of Anarchy (PoA)

$$R = \max \frac{SC(p)}{OPT} \geq 1$$

(max over all NE  $p$ ).

[Koutsoupias, Papadimitriou, 1999]

Coordination Ratio

[Mavronicolas, Spirakis, 2001]

[Roughgarden, Tardos, 2001]

But also

## The Price of Stability (PoS)

$$T = \min \frac{SC(p)}{OPT}$$

(min over all NE  $p$ )

[Schulz, Stier Moses, 2003]

[Anshelevich et al, 2004]

- Lots of results for PoA, PoS for congestion games, network creation games etc.

# How to Control Anarchy

- **Mechanisms** design
- **A set of rules and options put by game's designers.** Does not affect the **free will** of players. But appeals to their selfishness (e.g. payments, punishments, ads). Aims in “moving the game” to “good equilibria” (desirable by the designer)
- New challenges in algorithms!
- Auctions
- Lies and truthfulness
- Stackelberg's games (Leader plays first)

# Dynamics

- How can a **Selfish System** (e.g. the markets, Society, the Web) **approach** an Equilibrium?

- **Dynamics**

Players interact, learn and do selfish choices, and the “state” of the System changes with time

- Many, repeated, concurrent games all the time.

# The world is not perfect

- Players may be illogical and not so rational
- Players may have limited information about the game (s), or limited knowledge.
- Errors are human / also for Computers (“Trembling Hand”)
- Other factors (enemies of the System, “free-riders”, strange behaviour, ...)

## But, fortunately:

- Players can learn, adapt, evolve
- Biology and “Self-regulation”  
[Self-stabilization) [Dijkstra] [S. Dolev, E. Schiller]
- Equilibria in animal, plants (microbes)  
communities in antagonism or cooperation
- John Maynard Smith (1974)  
(Evolutionary Games).

## Yet another Science

- Mathematical Ecology  
(Alfred Lotka, Vito Volterra, 1920)  
(dynamics of moskitos, also of hunter-prey fish in Adriatic Sea ).
- Ancestor of Evolutionary Game Theory
- Evolutionary Methods in Economics  
[Robert Axelrod, 1984]

## **Relevant Math.**

- Nonlinear dynamical systems
- Differential Equations
- Attractors, oscillations, Equilibria
- Chaotic Behaviour!  
**(and, again, fixpoints!)**

# Dynamics of Selfish Systems

- **Norms** (Contracts, Social Rules)
- **“Internal” causes for change:**
  - players’ selfish behaviour
  - learning, adaptation
- **Externalities**
- **“Final” result** (equilibrium, stability, but also complex behaviour, chaos)

# A New Science

- Deep and elegant
- Different
- Strong interaction with Foundations of CS
- Emerges everywhere (Research, Education, funds)  
(also **new Industry**: e-commerce, ads, Social Nets ...)
- A new light in Complexity
- Isaac Asimov's "psychohistory"?

**MANY THANKS  
FOR LISTENING TO ME.**