



# **Dynamics and Equilibrium**

**Sergiu Hart**

**Presidential Address, GAMES 2008 (July 2008)**

**Revised and Expanded (February 2009)**

# DYNAMICS AND EQUILIBRIUM

***Sergiu Hart***

**Center for the Study of Rationality  
Dept of Economics      Dept of Mathematics  
The Hebrew University of Jerusalem**

**[hart@huji.ac.il](mailto:hart@huji.ac.il)**

**<http://www.ma.huji.ac.il/hart>**

# Papers

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- Hart and Mas-Colell, *Econometrica* 2000
- Hart and Mas-Colell, *J Econ Theory* 2001
- Hart and Mas-Colell, *Amer Econ Rev* 2003
- Hart, *Econometrica* 2005
- Hart and Mas-Colell, *Games Econ Behav* 2006
- Hart and Mansour, *Games Econ Behav* 2009 ?
- Hart, *Center for Rationality DP* 2008

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- Hart and Mas-Colell, *Econometrica* 2000
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# Nash Equilibrium

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*John Nash, Ph.D. Dissertation, Princeton 1950*

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**EQUILIBRIUM POINT:**

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## EQUILIBRIUM POINT:

**"Each player's strategy is optimal against those of the others."**

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# Dynamics

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- **"general"** : in all games
- rather than: in specific classes of games:
- two-person zero-sum games
  - two-person potential games
  - supermodular games
  - . . .



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- ***"leading to Nash equilibrium"***

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***There are no general, natural dynamics  
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- ***"leading to Nash equilibrium"*** :  
at a Nash equilibrium (or close to it)  
from some time on

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- bounded rationality***

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(deterministic or stochastic)
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- **broadcasting** the private information  
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- **fully rational learning**  
(prior beliefs on the strategies of the  
opponents, Bayesian updating, optimization)

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*Hart and Mas-Colell, AER 2003*



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## UNCOUPLED DYNAMICS :

Each player knows *only* his own payoff  
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(privacy-preserving, decentralized, distributed ...)

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# Games

***N*-person game** in strategic (normal) form:

- **Players**

$$i = 1, 2, \dots, N$$

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- **Players**

$$i = 1, 2, \dots, N$$

- For each player *i*: **Actions**

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- For each player *i*: **Payoffs (utilities)**

$$u^i(a) \equiv u^i(a^1, a^2, \dots, a^N)$$

# Dynamics

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- **Time**

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- At period  $t$  each player  $i$  chooses an **action**

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according to a probability distribution

$$\sigma_t^i \text{ in } \Delta(A^i)$$

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are the actions of all the players  
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- Only last period matters (“1-recall”)
- Time  $t$  does not matter (“stationary”)

# Impossibility

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**Theorem.** *There are **NO** uncoupled dynamics with 1-recall*

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*that yield almost sure convergence of play to pure Nash equilibria of the stage game in all games where such equilibria exist.*

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*Hart and Mas-Colell, GEB 2006*

# Proof

Consider the following two-person game, which has a unique pure Nash equilibrium

|    | C1  | C2  | C3  |
|----|-----|-----|-----|
| R1 | 1,0 | 0,1 | 1,0 |
| R2 | 0,1 | 1,0 | 1,0 |
| R3 | 0,1 | 0,1 | 1,1 |

# Proof

Consider the following two-person game, which has a unique pure Nash equilibrium **(R3,C3)**

|           | C1  | C2  | <b>C3</b>  |
|-----------|-----|-----|------------|
| R1        | 1,0 | 0,1 | 1,0        |
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Assume ***by way of contradiction*** that we are given an uncoupled, 1-recall, stationary dynamic that yields almost sure convergence to pure Nash equilibria when these exist

# Proof

- Suppose the play at time  $t - 1$  is **(R1,C1)**

|           | <b>C1</b> | C2  | C3         |
|-----------|-----------|-----|------------|
| <b>R1</b> | 1,0       | 0,1 | 1,0        |
| R2        | 0,1       | 1,0 | 1,0        |
| R3        | 0,1       | 0,1 | <b>1,1</b> |



# Proof

- Suppose the play at time  $t - 1$  is (R1,C1)
- **ROWENA is best replying at (R1,C1)**

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- Suppose the play at time  $t - 1$  is **(R1,C1)**
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*Proof:*

- Change the payoff function of COLIN so that **(R1,C1)** is the unique pure Nash eq.

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| <b>R1</b> | <b>1,0</b> | 0,1 | 1,0        |
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*Proof:*

- Change the payoff function of COLIN so that **(R1,C1)** is the unique pure Nash eq.
- In the new game, ROWENA *must* play **R1** after **(R1,C1)** (by *1-recall*, *stationarity*, and *a.s. convergence* to the pure Nash eq.)

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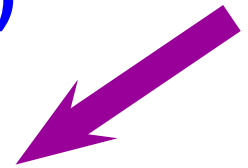
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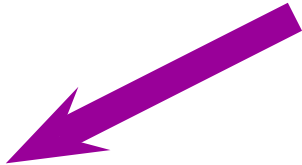
- Change the payoff function of COLIN so that **(R1,C1)** is the unique pure Nash eq.
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- By *uncoupledness*, the same holds in the original game

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- Suppose the play at time  $t - 1$  is  $(R1, C1)$
- **ROWENA is best replying at  $(R1, C1)$**
- $\Rightarrow$  **ROWENA will play  $R1$  also at  $t$**



# Proof

- ROWENA is best replying at  $t - 1$
  - $\Rightarrow$  ROWENA will play the same action at  $t$
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$\Rightarrow$  (R3,C3) **cannot be reached**  
(unless we start there)

# Possibility

**Theorem.** **THERE EXIST** *uncoupled* dynamics with **2-RECALL**

$$\sigma_t^i \equiv f^i(a_{t-2}, a_{t-1}; u^i)$$

*that yield almost sure convergence of play to pure Nash equilibria of the stage game in every game where such equilibria exist.*

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**THEN:** At  $t$  player  $i$  *plays  $a^i$  again*:  $a_t^i = a^i$

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**THEN:** At  $t$  player  $i$  *plays  $a^i$  again*:  $a_t^i = a^i$

**ELSE:** At  $t$  player  $i$  *randomizes uniformly over  $A^i$*

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# Possibility

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## **"Bad":**

- exhaustive search
- all players must use it
- takes a long time



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  - **simple and efficient:**
    - **computation**
    - **time**
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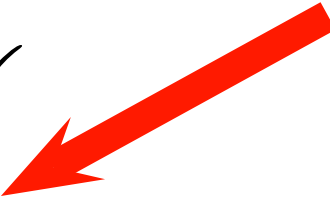
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    - **time to reach equilibrium ?** 
    - **information:** *uncoupledness* ✓

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A distributed computational procedure



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A distributed computational procedure
- $\Rightarrow$  **COMMUNICATION COMPLEXITY**

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*Yao 1979, Kushilevitz and Nisan 1997*

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- **Uncoupled dynamics leading to Nash equilibria**
  - **START:** Each player knows his own payoff function **[INPUTS]**
  - **COMMUNICATION:** The actions played are commonly observed
  - **END:** All players play a Nash equilibrium **[OUTPUT]**
- **COMMUNICATION COMPLEXITY** = the minimal number of rounds needed

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*Conitzer and Sandholm 2004*

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*Hart and Mansour, GEB 2009 (?)*

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- **Intuition:**
  - different games have different equilibria
  - the dynamic procedure must distinguish between them
  - no single player can do so by himself

# Dynamics and Nash Equilibrium

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## FACT

*There are **NO** general, natural dynamics leading to Nash equilibrium*

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- Perhaps we are asking too much?

# Dynamics and Nash Equilibrium

## RESULT

***There CANNOT BE general, natural dynamics leading to Nash equilibrium***

- **Perhaps we are asking too much?**
- For instance, the size of the data (the payoff functions) is *exponential* rather than polynomial in the number of players

# Correlated Equilibrium



# Correlated Equilibrium

## CORRELATED EQUILIBRIUM

---

*Aumann, JME 1974*

# Correlated Equilibrium

## CORRELATED EQUILIBRIUM :

**Nash equilibrium when players receive  
payoff-irrelevant information  
before playing the game**

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# Correlated Equilibria

## "Chicken" game

|       | LEAVE | STAY |
|-------|-------|------|
| LEAVE | 5, 5  | 3, 6 |
| STAY  | 6, 3  | 0, 0 |

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another **Nash equilibrium**



# Correlated Equilibria

## "Chicken" game

|       | LEAVE | STAY |     |     |
|-------|-------|------|-----|-----|
| LEAVE | 5, 5  | 3, 6 | 0   | 1/2 |
| STAY  | 6, 3  | 0, 0 | 1/2 | 0   |

a (publicly) correlated equilibrium

# Correlated Equilibria

## "Chicken" game

|       | LEAVE | STAY |
|-------|-------|------|
| LEAVE | 5, 5  | 3, 6 |
| STAY  | 6, 3  | 0, 0 |

|   | L   | S   |
|---|-----|-----|
| L | 1/3 | 1/3 |
| S | 1/3 | 0   |

another **correlated equilibrium**

- after signal L play LEAVE
- after signal S play STAY

# Correlated Equilibrium

A **Correlated Equilibrium** is a Nash equilibrium when the players receive payoff-irrelevant signals before playing the game (Aumann 1974)

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- Boston Celtics’ front line



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A joint distribution  $z$  is a **correlated equilibrium**



$$\sum_{s^{-i}} u(j, s^{-i}) z(j, s^{-i}) \geq \sum_{s^{-i}} u(k, s^{-i}) z(j, s^{-i})$$

for all  $i \in N$  and all  $j, k \in S^i$

# Dynamics & Correlated Equilibria

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## RESULT

**THERE EXIST** *general, natural dynamics*  
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- *Regret Matching*

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*Hart and Mas-Colell, Ec'ca 2000*

# Dynamics & Correlated Equilibria

## RESULT

**THERE EXIST** *general, natural dynamics*  
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- *Regret Matching*
- General regret-based dynamics

---

*Hart and Mas-Colell, Ec'ca 2000, JET 2001*

# Regret Matching



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# Regret Matching

- **"REGRET"**: the increase in past payoff, if any, if a different action would have been used
- **"MATCHING"**: switching to a different action with a probability that is proportional to the regret for that action

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**THERE EXIST *general, natural* dynamics  
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- **"general"**: in all games
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computation, time, information

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**THERE EXIST** *general, natural dynamics*  
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- **"general"**: in all games
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  - **simple and efficient**:  
computation, time, information
- **"leading to correlated equilibria"**:  
statistics of play become close to  
**CORRELATED EQUILIBRIA**



# Dynamics and Equilibrium

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- **CORRELATED EQUILIBRIUM:**  
a solution of finitely many *linear inequalities*
- *set-valued* fixed-point (curb sets)?

# Dynamics and Equilibrium

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"LAW OF CONSERVATION OF COORDINATION":

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*There must be some* **COORDINATION** —

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*There must be some COORDINATION —  
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# The "Program"

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A. Demarcate the BORDER between

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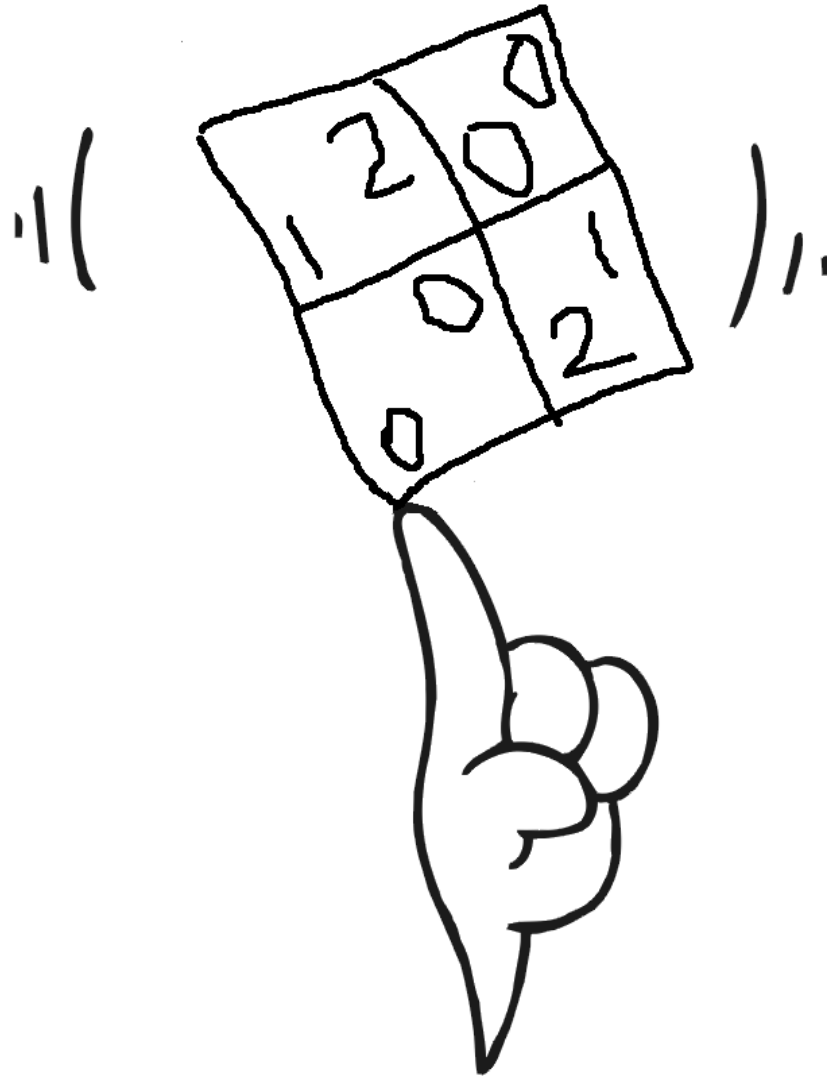
## B. Find NATURAL dynamics for the various equilibrium concepts

# Dynamics and Equilibrium

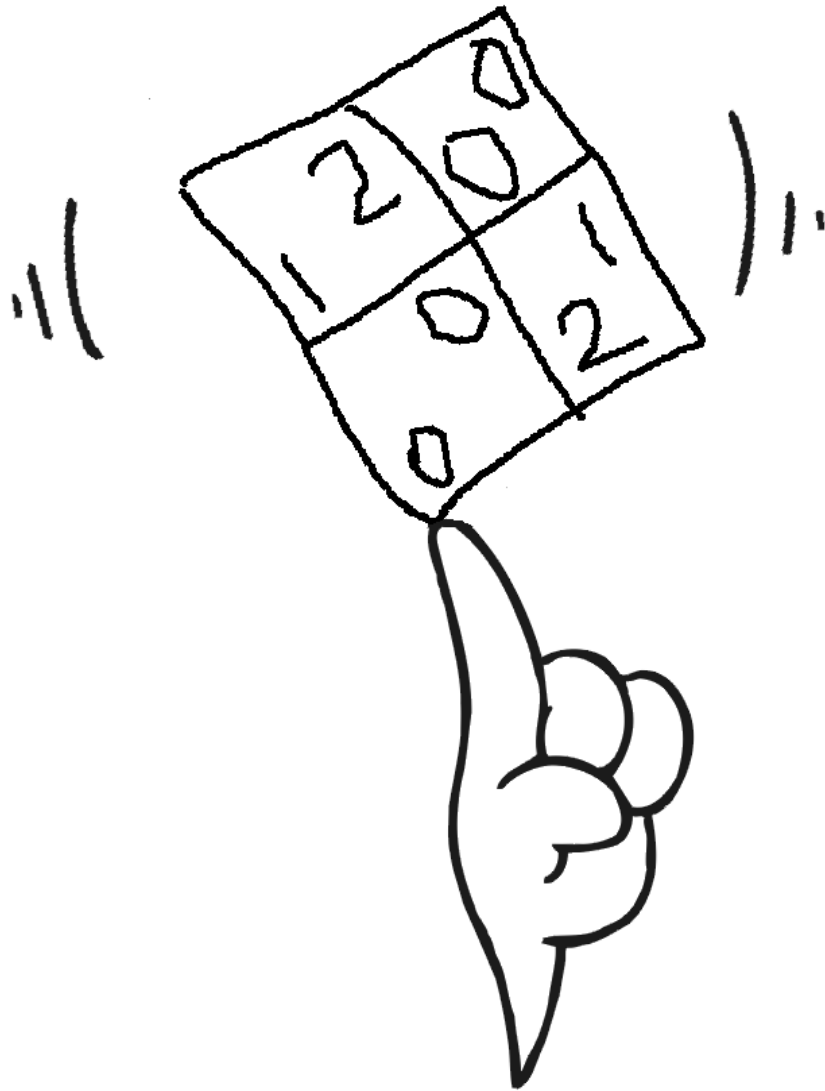
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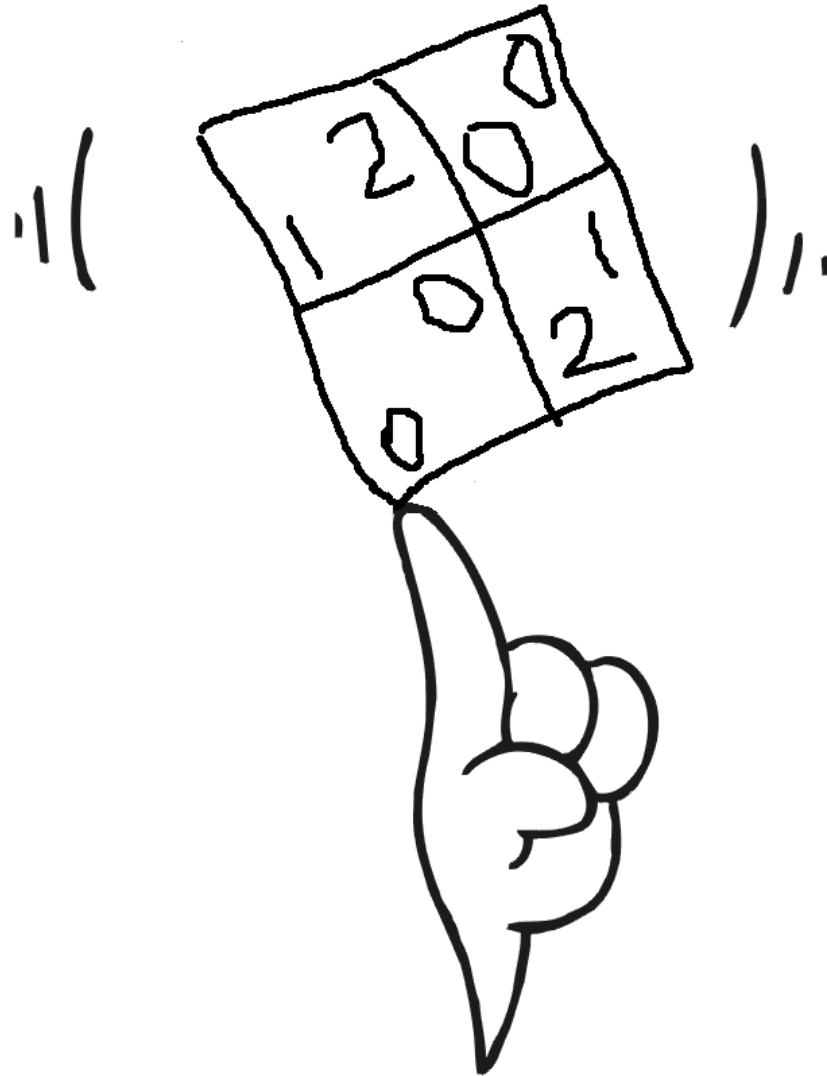
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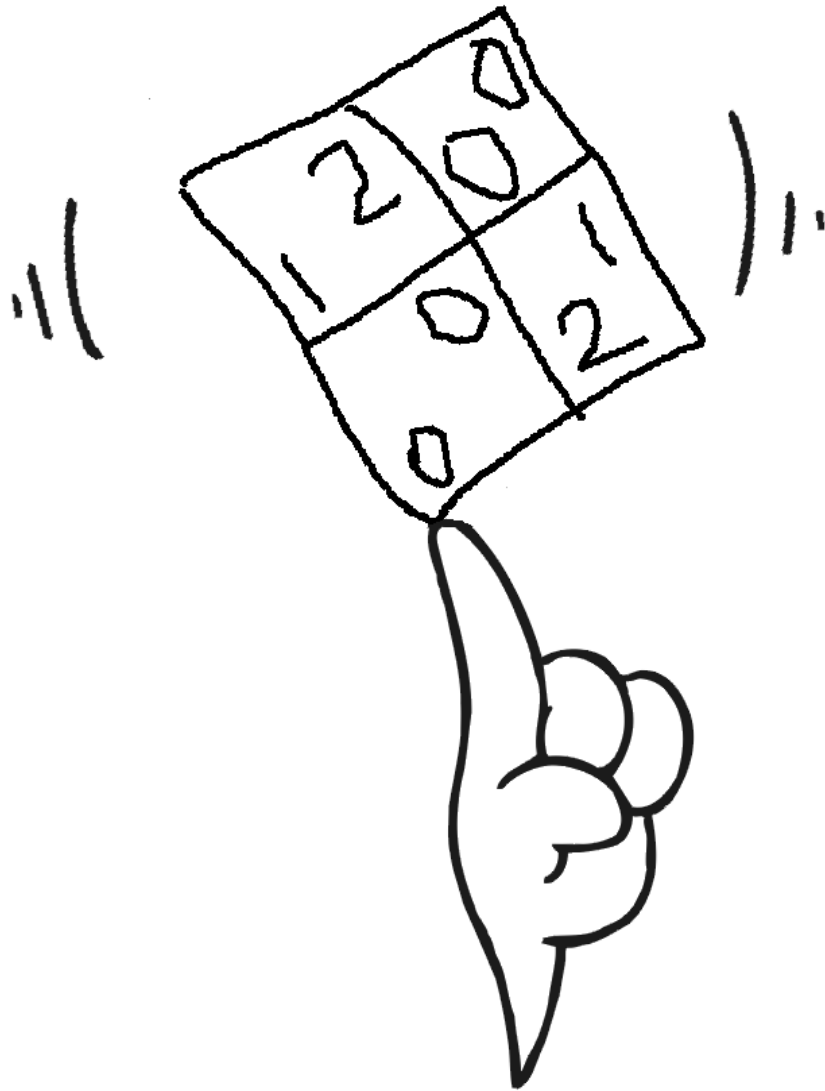
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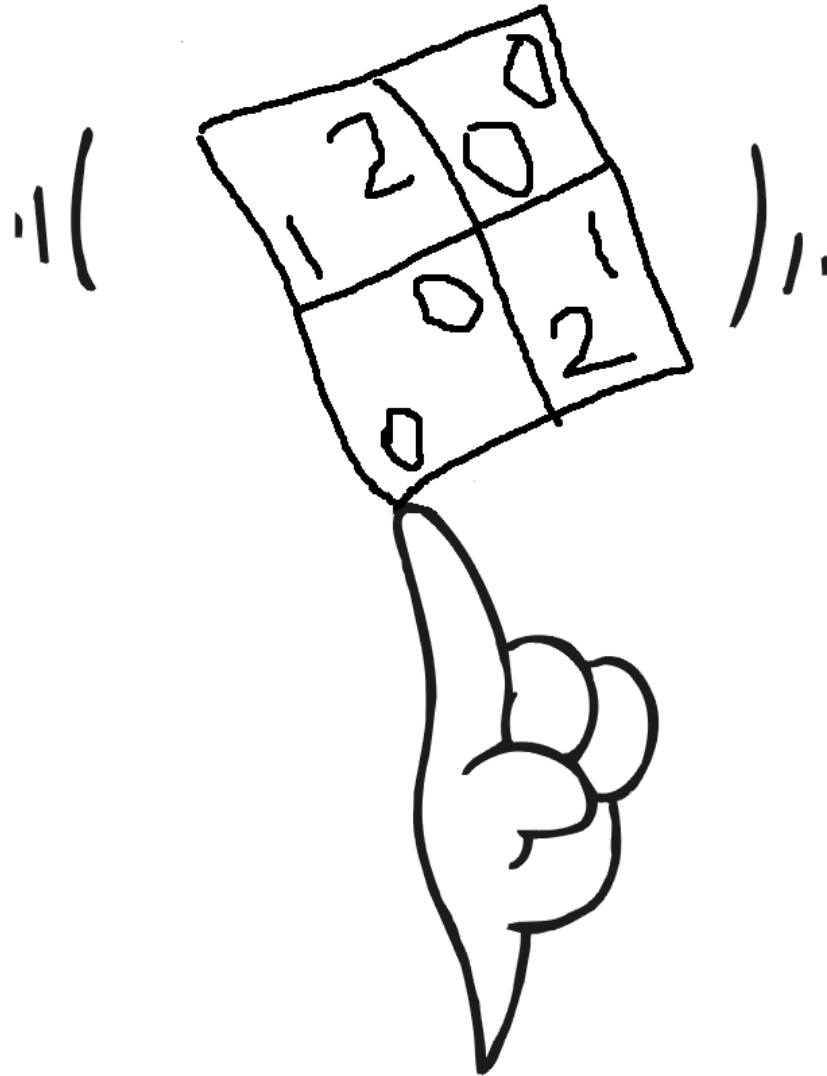
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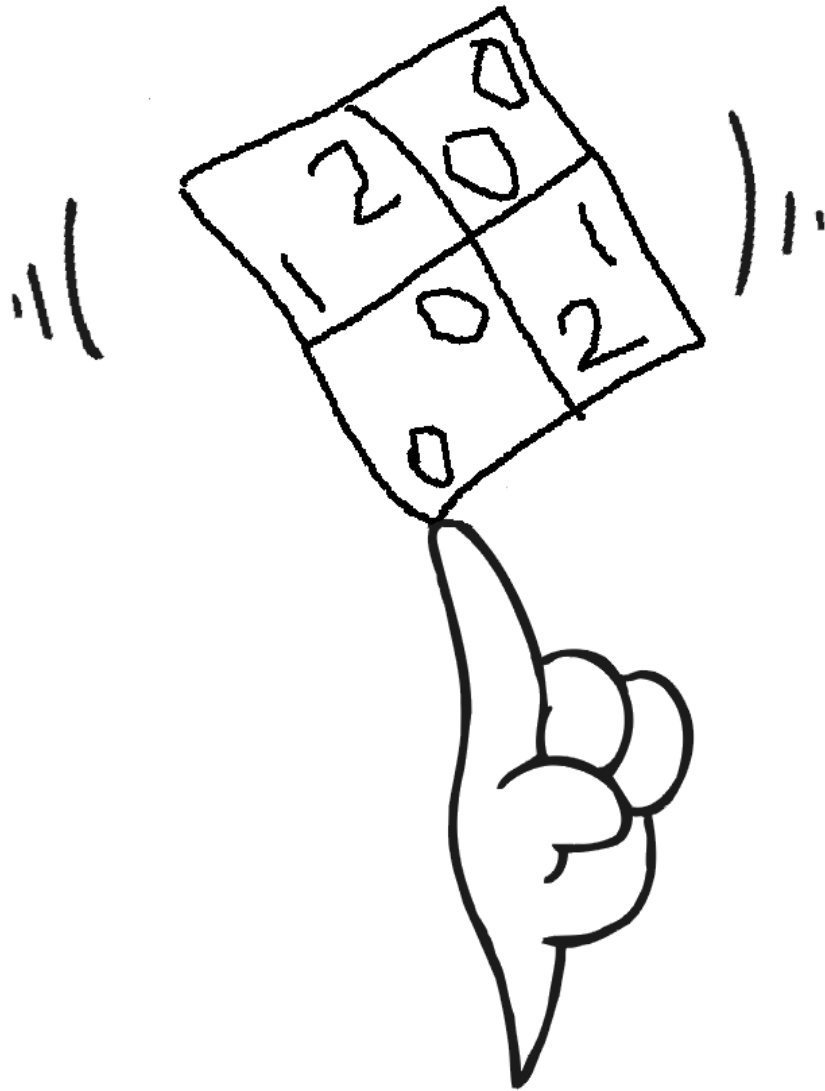
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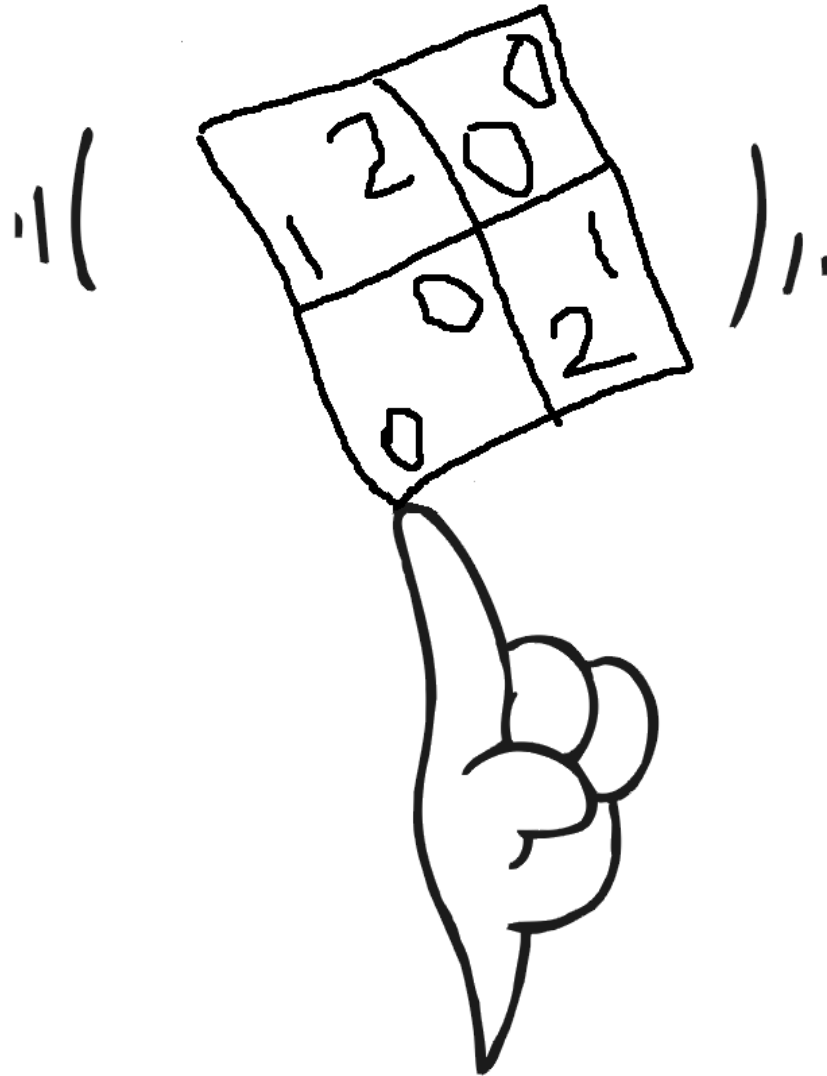
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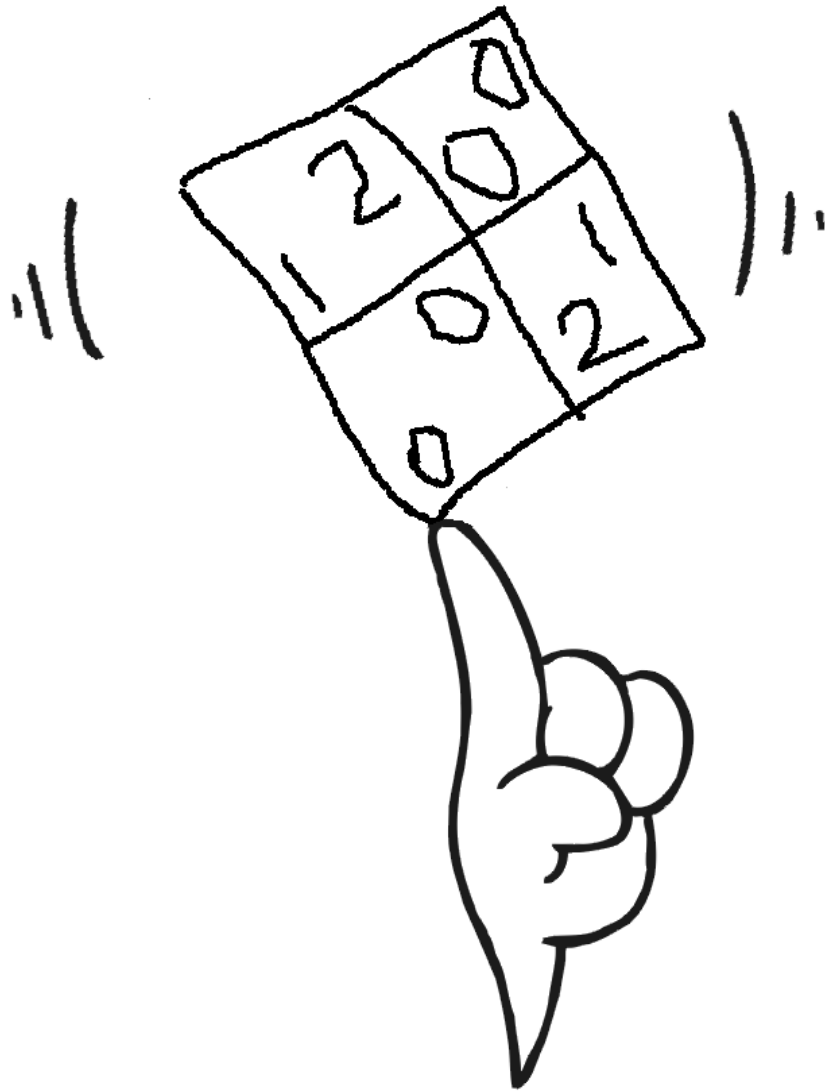
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# Dynamics and Equilibrium





# My Game Theory

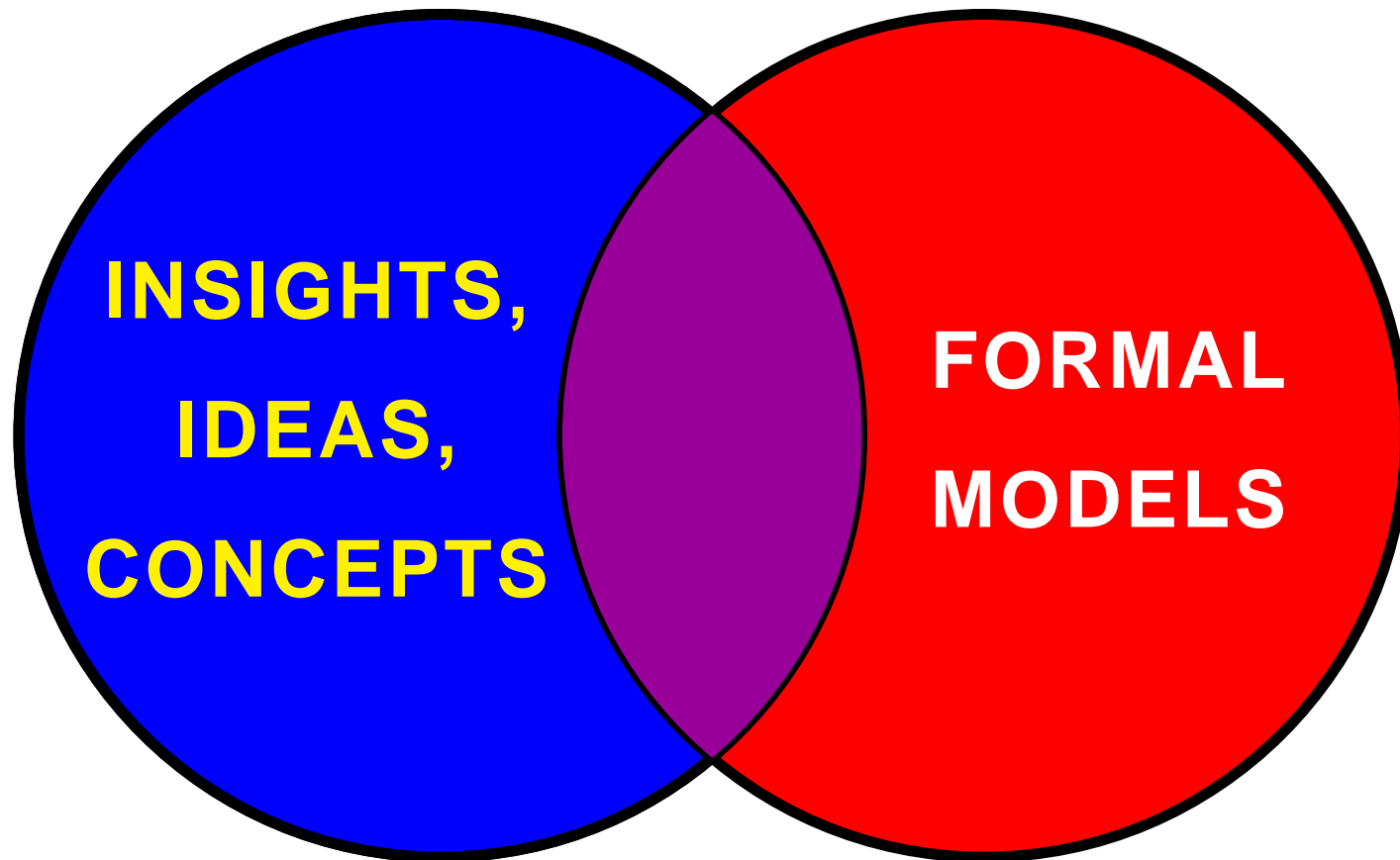
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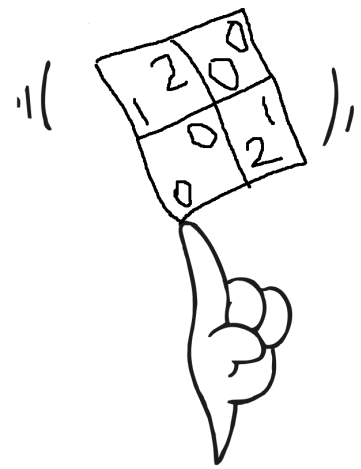
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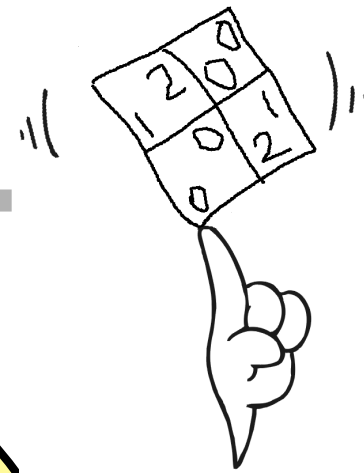


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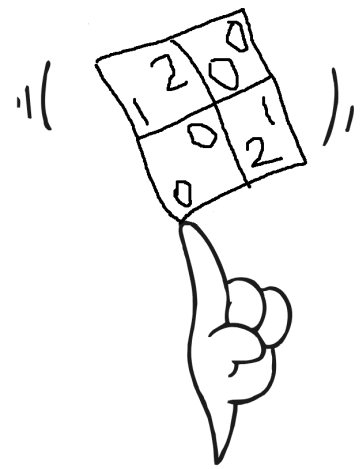


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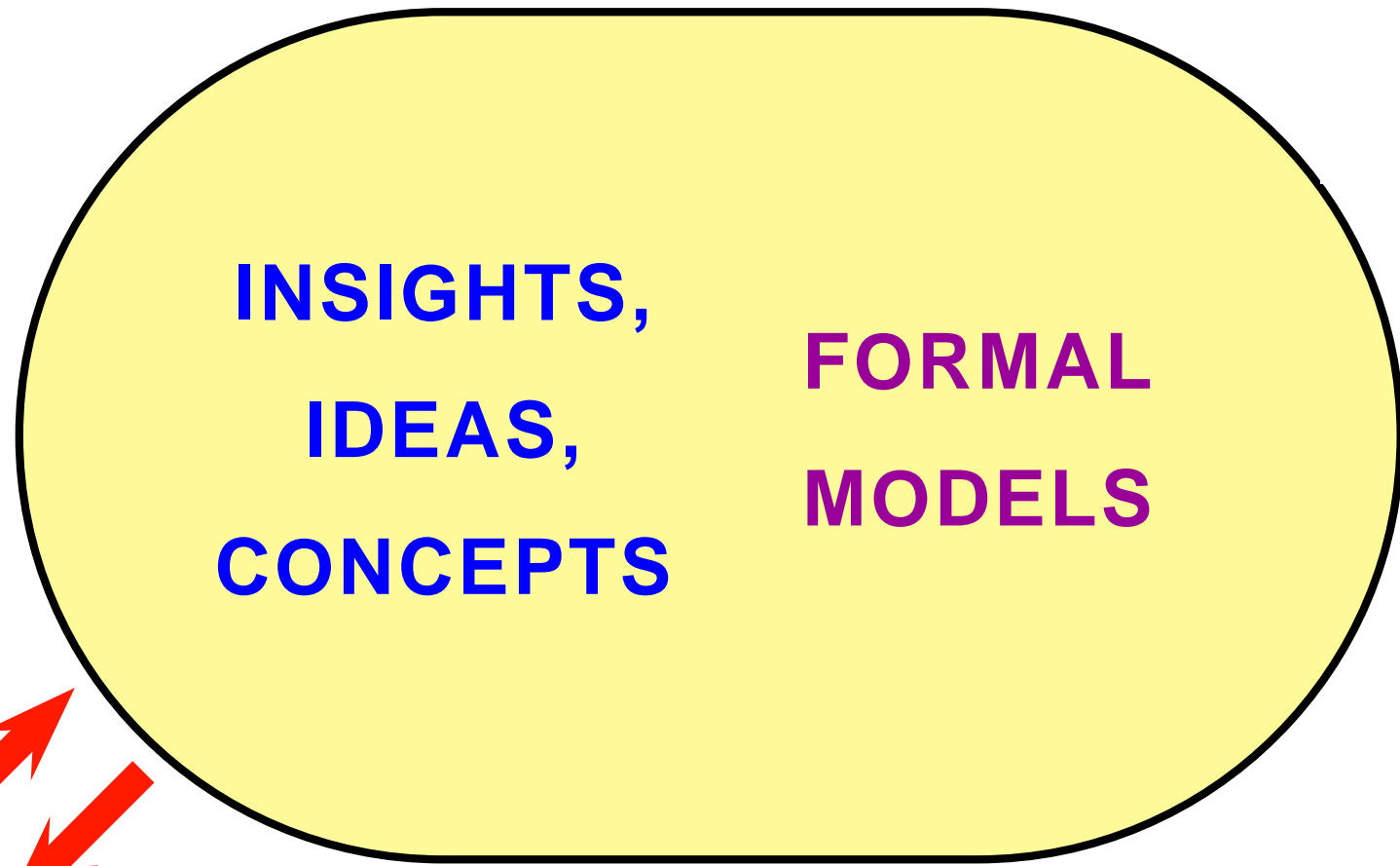


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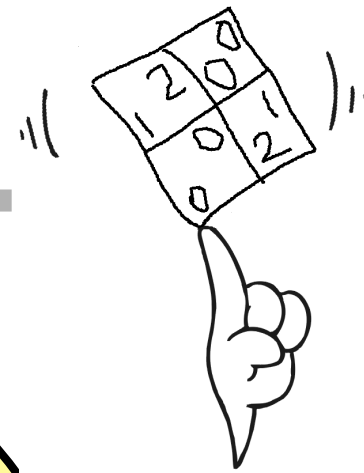


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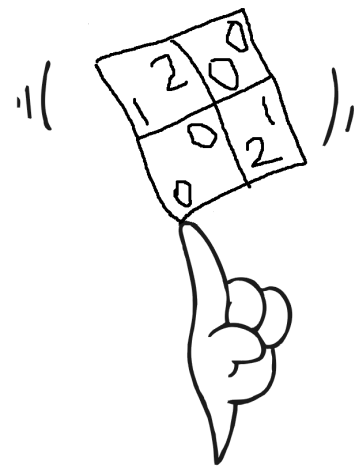


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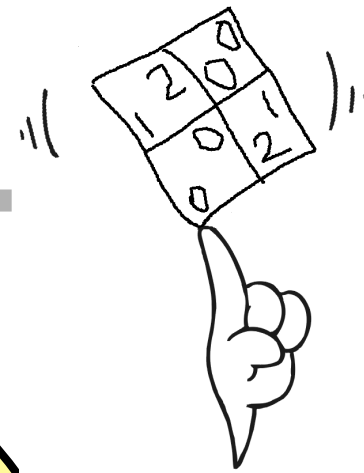


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