

# GAME THEORY: CONCEPTS AND PRACTICAL EXERCISES

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*\*thanks to Bary, Alex and Heiko for some slides*

# A game



## Rules:

- ① **Players:** All of you:  
<https://scienceexperiment.online/classroom/r/Kp0xdW>
- ② **Actions:** Choose a number between 0 and 100
- ③ **Outcome:** The player with the number closest to half the average of all submitted numbers wins.
- ④ **Payoffs:** He will receive 10CHF, which I will pay out right after the game.
- ⑤ In case of several winners, divide payment by number of winners and pay all winners.

# A game



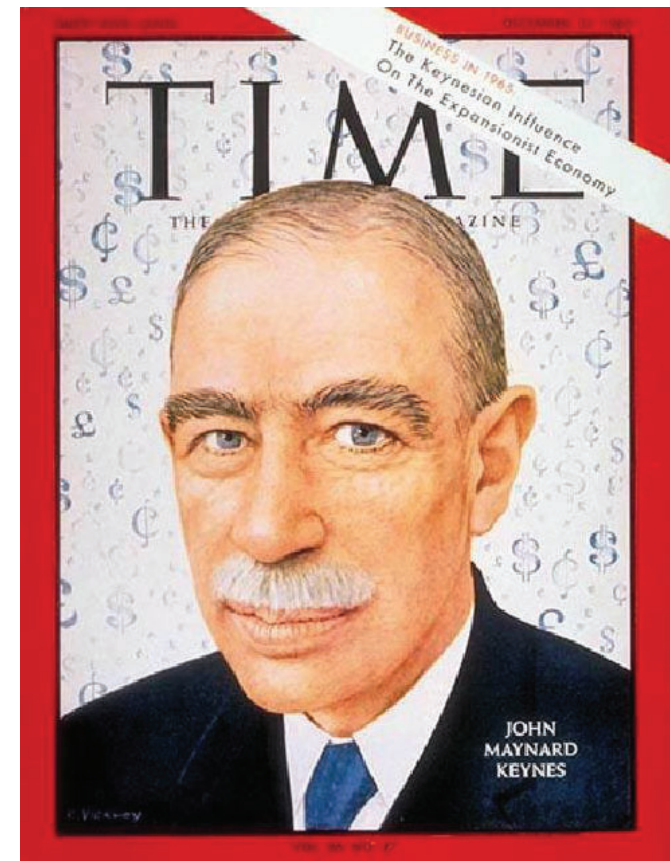
# Why "beauty contest"?



Analogy between stock markets and newspaper contest in which people guess what faces others will guess are most beautiful.

“...It is not a case of choosing those [faces] that, to the best of one’s judgment, are really the prettiest, nor even those that average opinion genuinely thinks the prettiest. We have reached the third degree where we devote our intelligences to anticipating what average opinion expects the average opinion to be. And there are some, I believe, who practice the fourth, fifth and higher degrees.”

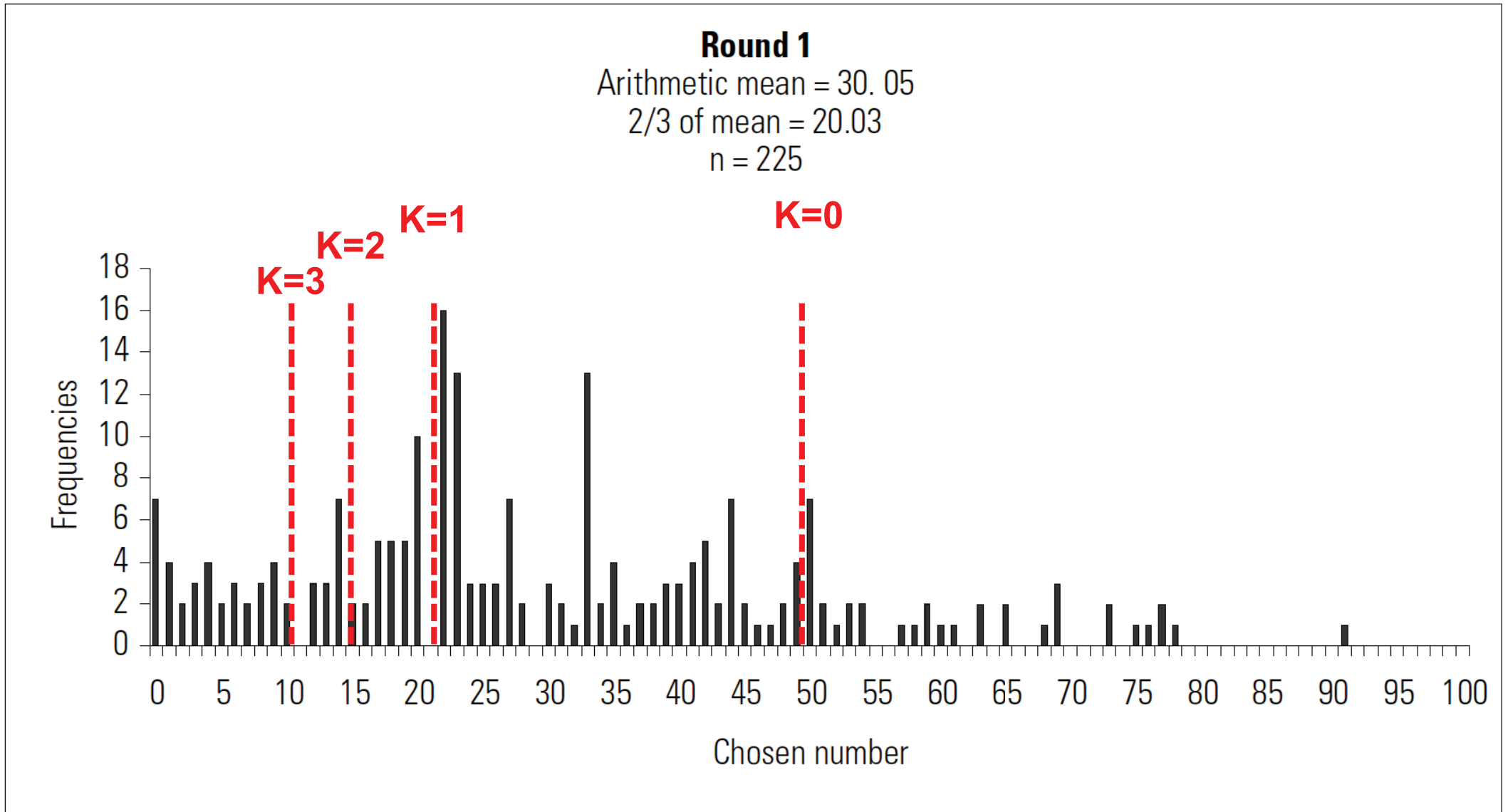
*(John Maynard Keynes, General Theory of Employment, Interest, and Money, 1936, p.156).*



What did you do?

# Typical behavior?

# Beliefs and learning



Diekmann, Andreas. "Rational choice, evolution and the "Beauty Contest"." *Raymond Boudon. A Life in Sociology*. Oxford: Bardwell (2009), p.,8 ff.



# What explains?

# One explanation: Cognitive Hierarchy Theory

Level 0 (“no reasoning”)  
random guess or simple rules

Level 1 reacts to base strategy at level 0

Guesses  $\frac{2}{3}$  of 50 = 33

Level 2 reacts to level 1

Guesses  $\frac{2}{3}$  of  $\frac{2}{3}$  of 50 = 22

⋮

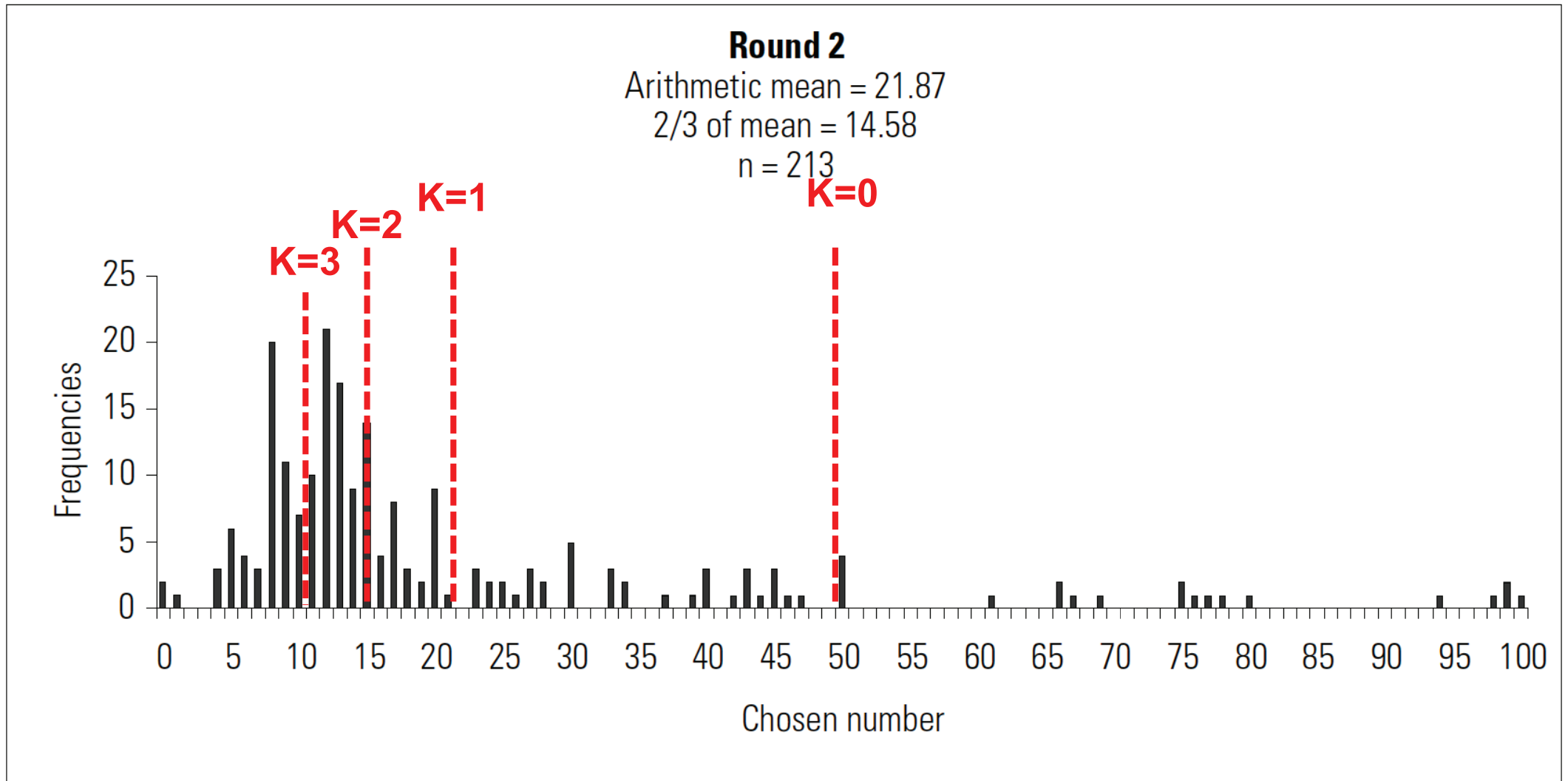
Level k reacts to level k-1

Guesses  $(\frac{2}{3})^k \xrightarrow{k \rightarrow \infty} 0$



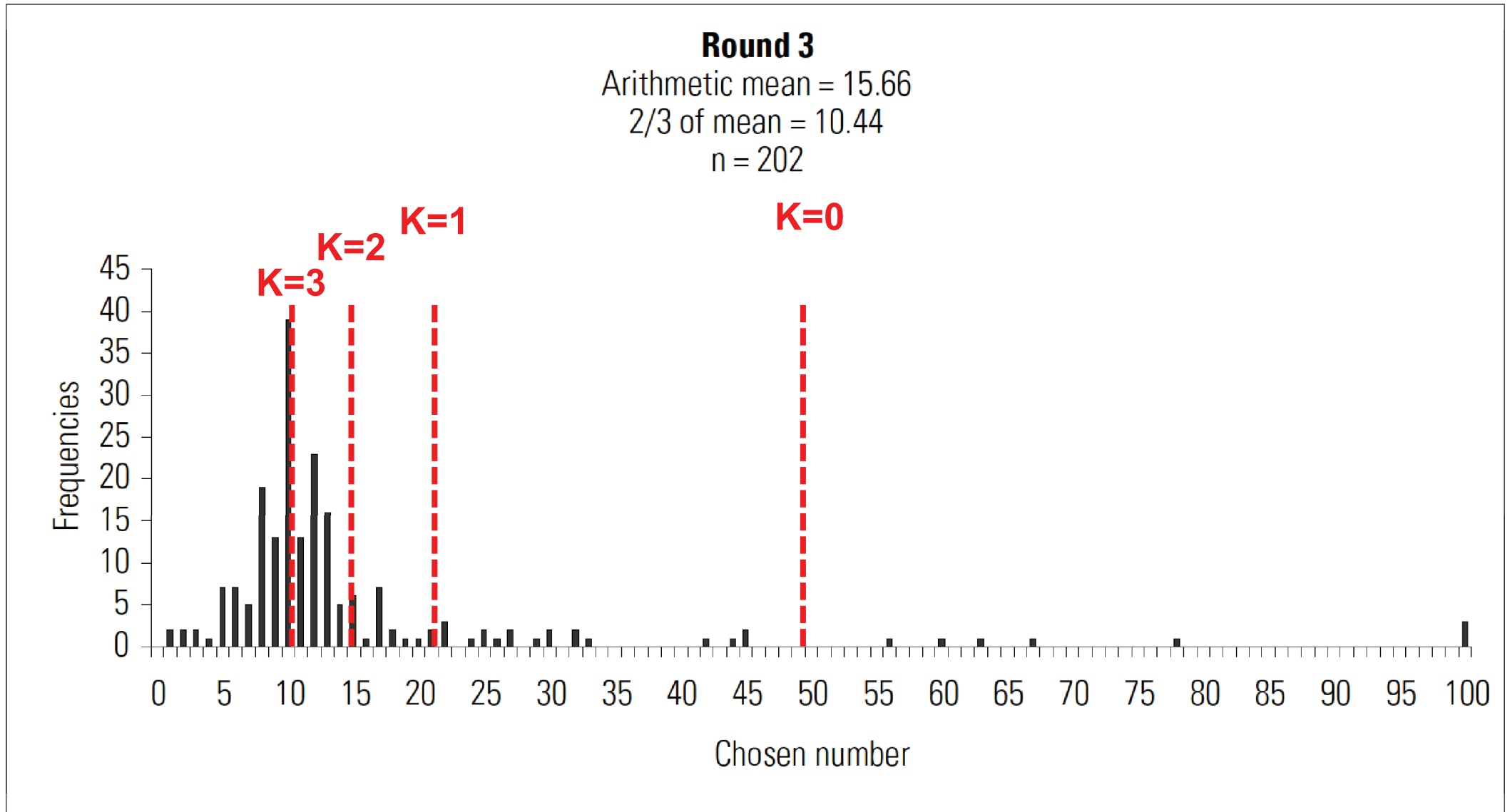
What happens if repeated?

# Beliefs and learning



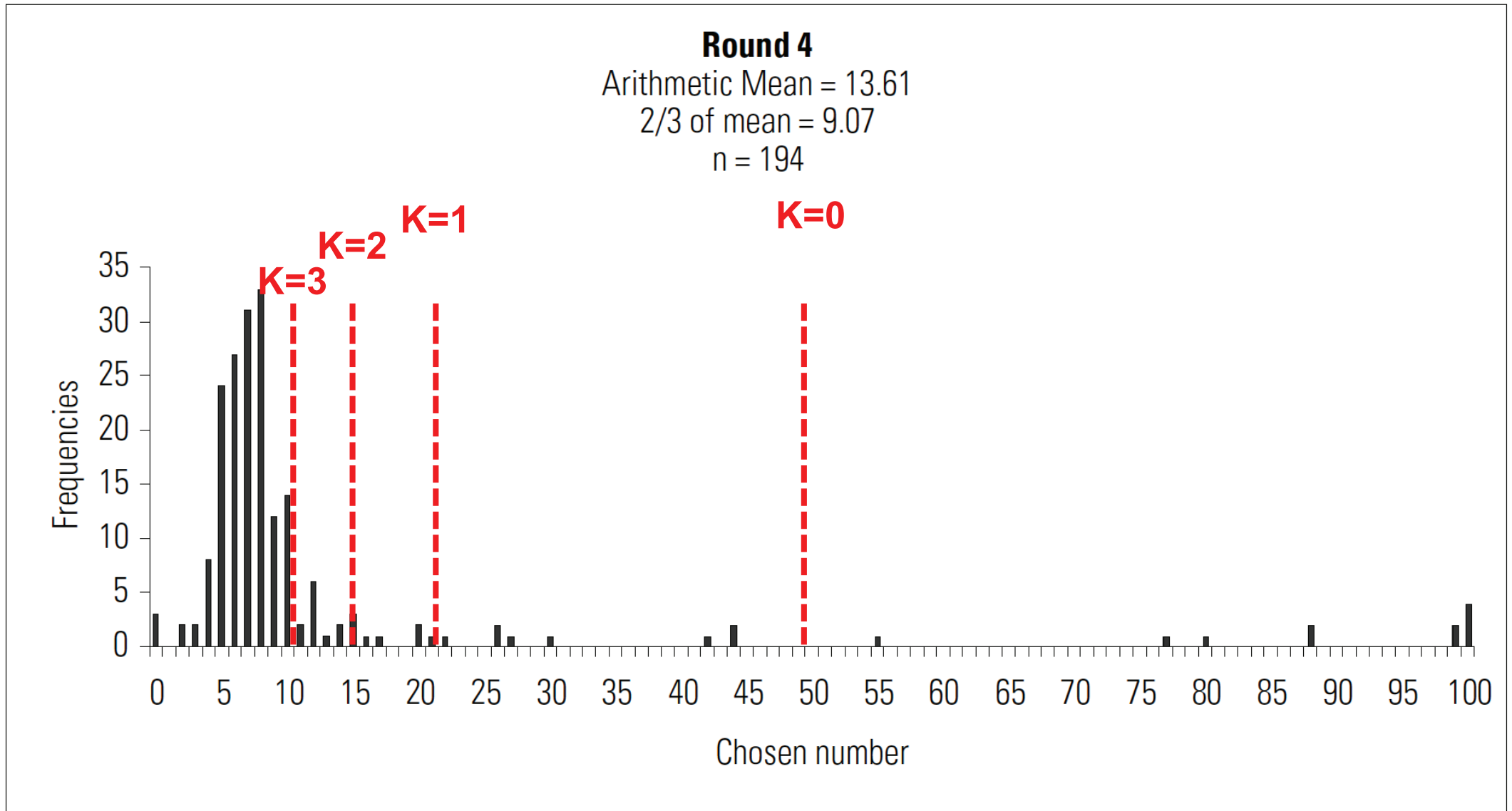
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# Beliefs and learning



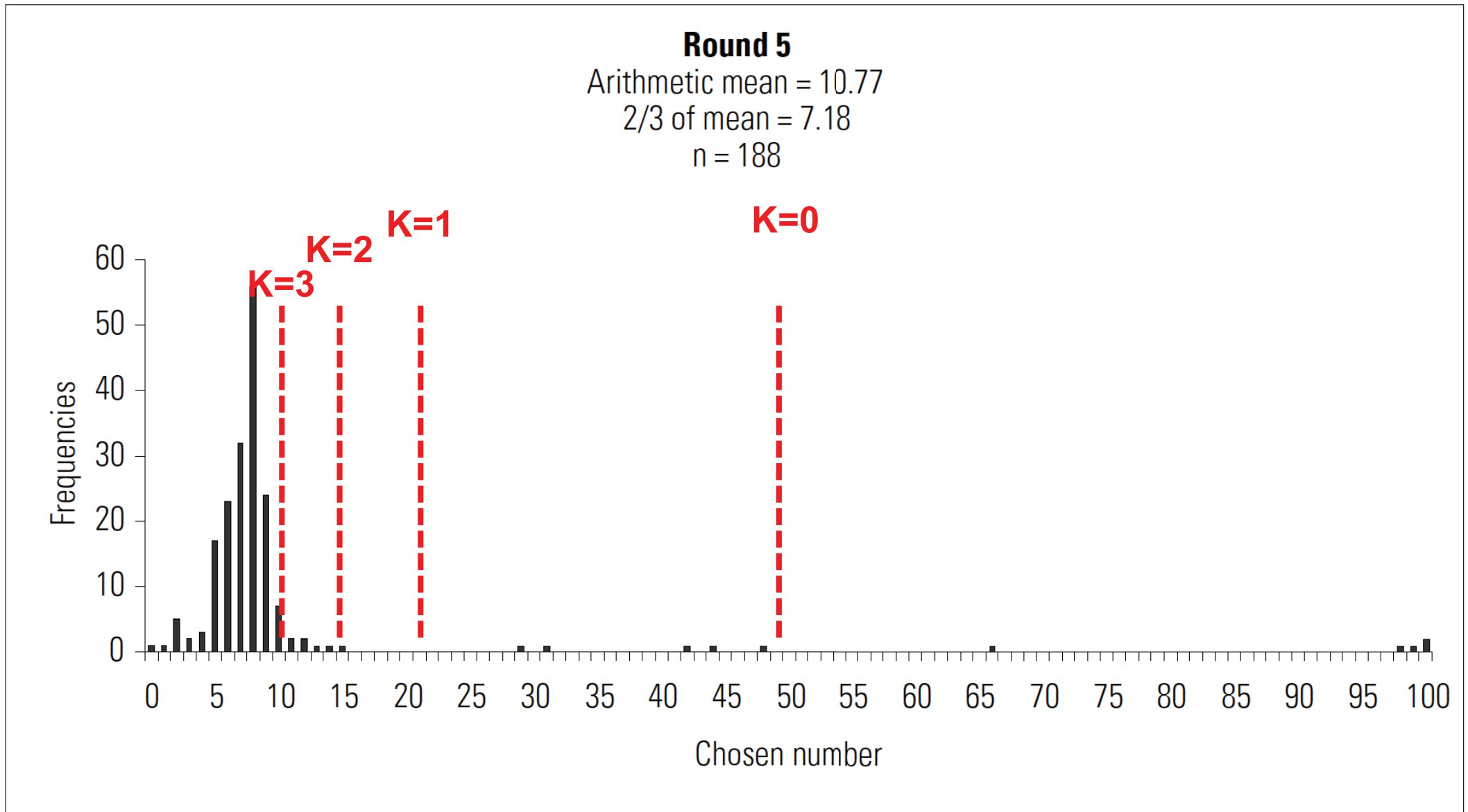
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# Beliefs and learning



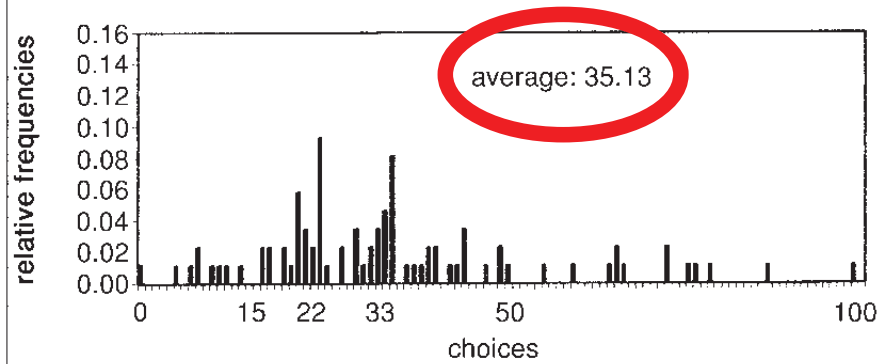
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# Beliefs and learning

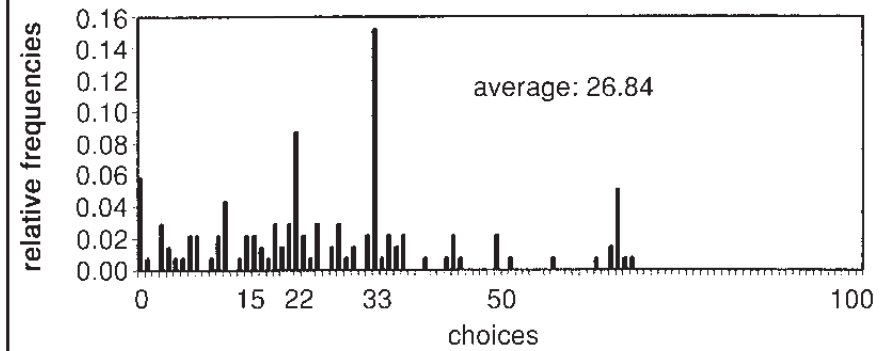


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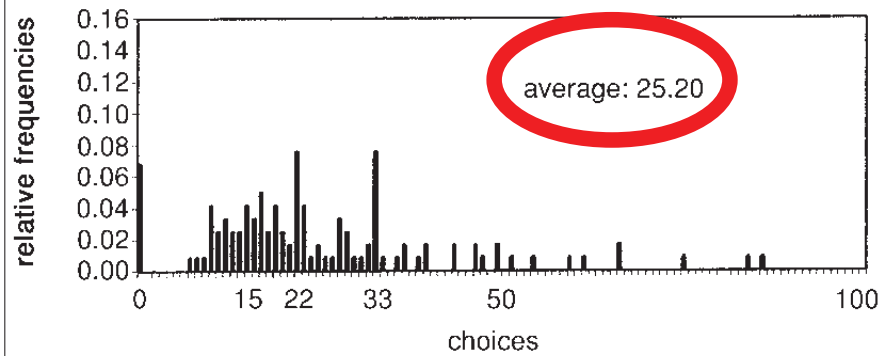
### 1. Lab experiments (1-5)



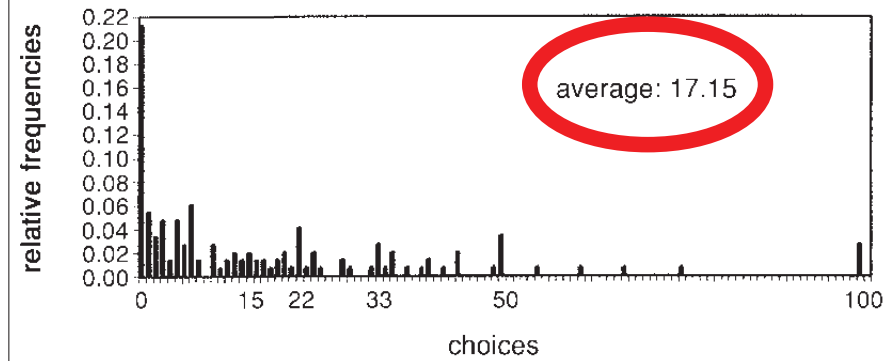
### 2. Classroom experiments (6,7)



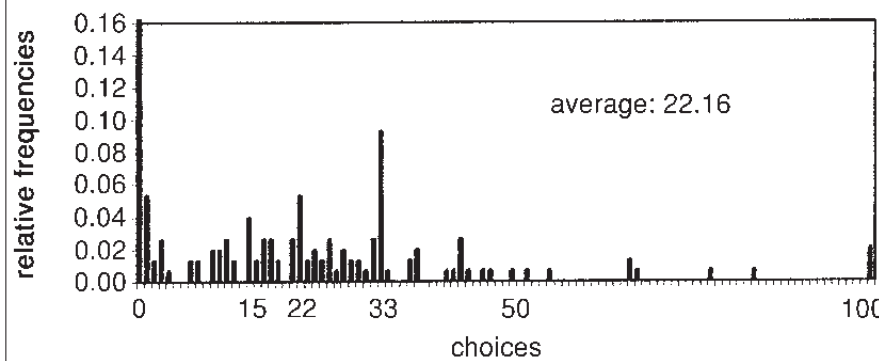
### 3. Take-home experiments (8,9)



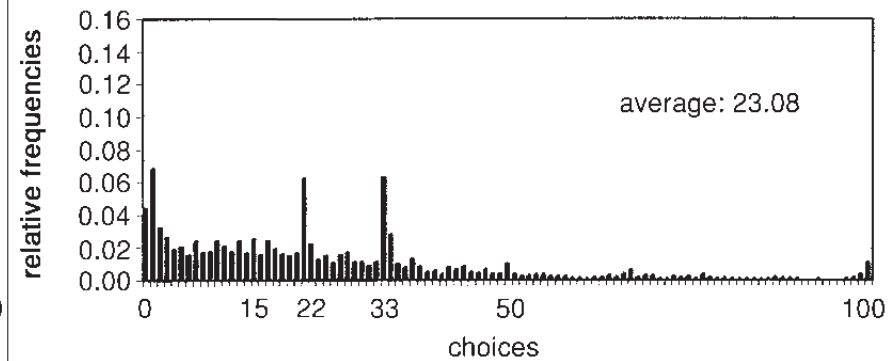
### 4. Theorists experiments (10-13)



### 5. Internet Newsgroup experiment



### 6. Newspaper experiments (15-17)





FINANCIAL TIMES

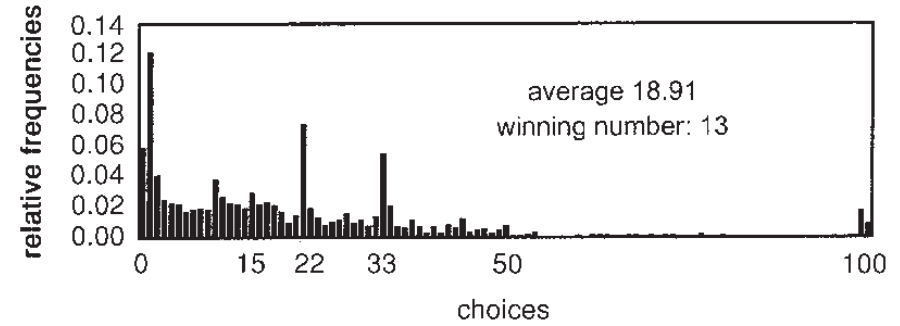
Spektrum  
DER WISSENSCHAFT

Expansión

Bosch-Domènech et al. (2002, AEA)

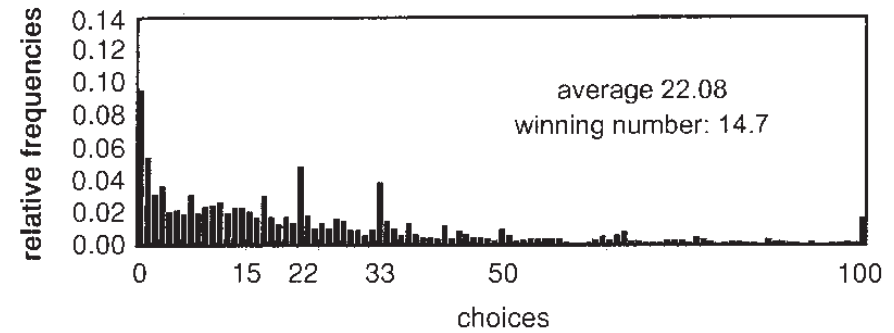
(a)

Financial Times experiment (1,468 subjects)



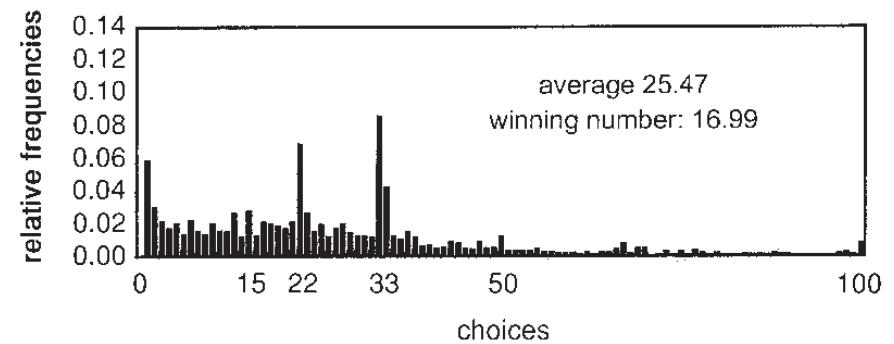
(b)

Spektrum experiment (2,729 subjects)



(c)

Expansión experiment (3,696 subjects)



# Some concepts

# Acknowledgments

- Bary Pradel ski (ETHZ)
- Peyton Young (Oxford, LSE)
- Bernhard von Stengel (LSE)
- Francoise Forges (Paris Dauphine)
- Paul Duetting (LSE)
- Jeff Shamma (Georgia Tech, KAUST)
- Joergen Weibull (Stockholm, TSE)
- Andreas Diekmann (ETHZ)
- Dirk Helbing (ETHZ)

# Game theory

A tour of its people, applications and concepts

- ① von Neumann
- ② Nash
- ③ Aumann, Schelling, Selten, Shapley
- ④ Today



John von Neumann (1903-1957)

# What is game theory?

- A mathematical language to express models of, as Myerson says: “conflict and cooperation between intelligent rational decision-makers”
- In other words, *interactive decision theory* (Aumann)
- Dates back to von Neumann & Morgenstern (1944)
- Most important solution concept: the Nash (1950) equilibrium

# Games and Non-Games

What is a game? And what is not a game?

# Uses of game theory

- *Prescriptive* agenda versus *descriptive* agenda
- “Reverse game theory”/mechanism design:
  - “in a design problem, the goal function is the main given, while the mechanism is the unknown.” (Hurwicz)
- The mechanism designer is a game designer. He studies
  - What agents would do in various games
  - And what game leads to the outcomes that are most desirable



# Game theory revolutionized several disciplines

- Biology (evolution, conflict, etc.)
- Social sciences (economics, sociology, political science, etc.)
- Computer science (algorithms, control, etc.)
  
- game theory is now applied widely (e.g. regulation, online auctions, distributed control, medical research, etc.)

# Its impact in economics (evaluated by Nobel prizes)

- 1972: **Ken Arrow** – general equilibrium
- 1994: **John Nash, Reinhard Selten, John Harsanyi** – solution concepts
- 2005: **Tom Schelling** and **Robert Aumann** – evolutionary game theory and common knowledge
- 2007: **Leonid Hurwicz, Eric Maskin, Roger Myerson** – mechanism design
- 2009: **Lin Ostrom** – economic governance, the commons
- 2012: **Al Roth** and **Lloyd Shapley** – market design
- 2014: **Jean Tirole** – markets and regulation
- 2016: **Oliver Hart** and **Bengt Holmström** – contract theory
- 2017: **Richard Thaler** – limited rationality, social preferences

# Part 1: game theory

## “Introduction” / Tour of game theory

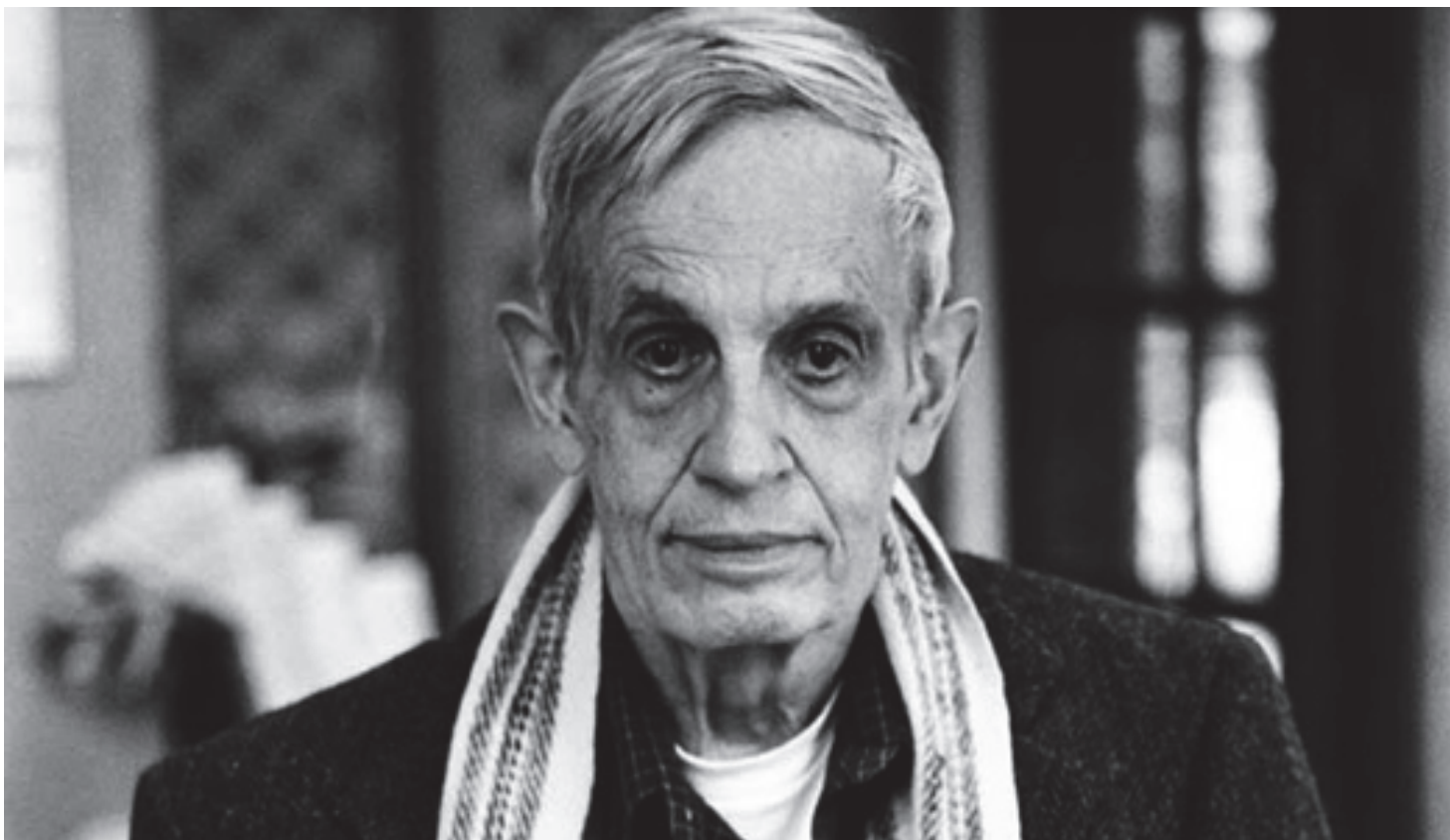
### Non-cooperative game theory

- No binding contracts can be written
- Players are individuals
- Main solution concepts:
  - Nash equilibrium
  - Strong equilibrium

### Cooperative game theory

- Binding contract can be written
- Players are individuals and coalitions of individuals
- Main solution concepts:
  - Core
  - Shapley value

# Noncooperative game theory



John Nash (1928-2015)

# A noncooperative game (normal-form)

- **players:**  $N = \{1, 2, \dots, n\}$  (finite)
- **actions/strategies:** (each player chooses  $s_i$  from his own finite strategy set;  $S_i$  for each  $i \in N$ )
  - resulting strategy combination:  $s = (s_1, \dots, s_n) \in (S_i)_{i \in N}$
- **payoffs:**  $u_i = u_i(s)$ 
  - payoffs resulting from the outcome of the game determined by  $s$

## Some 2-player examples

- **Prisoner's dilemma** – social dilemma, tragedy of the commons, free-riding
  - Conflict between individual and collective incentives
- **Harmony** – aligned incentives
  - No conflict between individual and collective incentives
- **Battle of the Sexes** – coordination
  - Conflict and alignment of individual and collective incentives
- **Hawk dove/Snowdrift** – anti-coordination
  - Conflict and alignment of individual and collective incentives
- **Matching pennies** – zero-sum, rock-paper-scissor
  - Conflict of individual incentives

		Player 2	
		Heads	Tails
Player 1	Heads	1,-1	-1,1
	Tails	-1,1	1,-1

## Matching pennies

		A	
		Confess	Stay quiet
B	Confess	-6, -6	-10, 0
	Stay quiet	-10, 0	-2, -2

## Prisoner's dilemma



		WOMAN	
		Boxing	Shopping
MAN	Boxing	2,1	0,0
	Shopping	0,0	1,2

Battle of the sexes

		Player 2	
		Hawk	Dove
Player 1	Hawk	-2,-2	4,0
	Dove	0,4	2,2

Hawk-Dove game

		Company B	
		Cooperate	Not Cooperate
Company A	Cooperate	9,9	4,7
	Not Cooperate	7,4	3,3

Harmony game

# Equilibrium

## Equilibrium/solution concept:

An **equilibrium/solution** is a rule that maps the structure of a game into an equilibrium set of strategies  $s^*$ .

# Nash Equilibrium

## Definition: Best-response

Player  $i$ 's **best-response** (or, reply) to the strategies  $s_{-i}$  played by all others is the strategy  $s_i^* \in S_i$  such that

$$u_i(s_i^*, s_{-i}) \geq u_i(s'_i, s_{-i}) \quad \forall s'_i \in S_i \text{ and } s'_i \neq s_i^*$$

## Definition: (Pure-strategy) Nash equilibrium

All strategies are *mutual best responses*:

$$u_i(s_i^*, s_{-i}) \geq u_i(s'_i, s_{-i}) \quad \forall s'_i \in S_i \text{ and } s'_i \neq s_i^*$$

		A	
		Confess	Stay quiet
B	Confess	-6, -6	-10, 0
	Stay quiet	-10, 0	-2, -2

**Prisoner's dilemma:** both players confess (defect)

		WOMAN	
		Boxing	Shopping
MAN	Boxing	2,1	0,0
	Shopping	0,0	1,2

**Battle of the sexes:** coordinate on either option

		Player 2	
		Heads	Tails
Player 1	Heads	1,-1	-1,1
	Tails	-1,1	1,-1

Matching pennies: none (in pure strategies)



		Player 2	
		Hawk	Dove
Player 1	Hawk	-2,-2	4,0
	Dove	0,4	2,2

**Hawk-dove:** either of the two hawk-dove outcomes

		Company B	
		Cooperate	Not Cooperate
Company A	Cooperate	9,9	4,7
	Not Cooperate	7,4	3,3

**Harmony:** both cooperate

# Pure-strategy N.E. for our 2-player examples

- **Prisoner's dilemma** – social dilemma
  - Unique NE – socially undesirable outcome
- **Harmony** – aligned incentives
  - Unique NE – socially desirable outcome
- **Battle of the Sexes** – coordination
  - Two NE – both Pareto-optimal
- **Hawk dove/Snowdrift** – anti-coordination
  - Two NE – Pareto-optimal, but perhaps Dove-Dove “better”
- **Matching pennies** – zero-sum, rock-paper-scissor
  - No (pure-strategy) NE

# How about our initial game

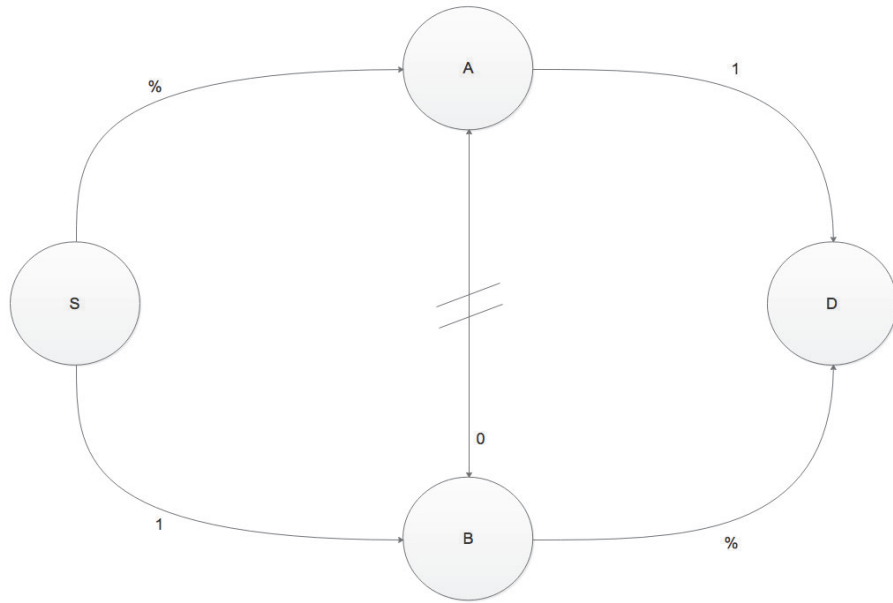
Remember the rules were:

- ① Choose a number between 0 and 100
- ② The player with the number closest to half the average of all submitted numbers wins 10CHF

What is the Nash Equilibrium?

0

# Braess' Paradox



New road worsens congestion!

The story:

- 60 people travel from S to D
- Initially, there is no middle road. The NE is such that 30 people travel one way, the others the other way, and each driver drives 90 mins.
- A middle road is build. This road is super efficient. Now everyone will use it and drive the same route, and the NE will worsen to  $119/120$  mins.

# Course admin

- Information about the course, and materials/slides of speakers, will be made available at  
[https://gametheory.online/project\\_show/32](https://gametheory.online/project_show/32)
- Also, please contact me directly if you have any questions about the course:
  - Heinrich: [hmax@ethz.ch](mailto:hmax@ethz.ch)
  - Heiko

# Schedule (preliminary) I

1) 19.02.	Introduction: a quick tour of game theory	Heinrich Nax
2) 26.02.	Cooperative game theory <ul style="list-style-type: none"> <li>●Core and Shapley value</li> <li>●Matching markets</li> </ul>	Heinrich Nax
3) 05.03.	Non-cooperative game theory: Normal form <ul style="list-style-type: none"> <li>●Utilities</li> <li>●Best replies</li> </ul>	Bary Pradelski
4) 12.03.	The Nash equilibrium <ul style="list-style-type: none"> <li>●Proof</li> <li>●Interpretations and refinements</li> </ul>	Bary Pradelski
5) 19.03.	Non-cooperative game theory: dynamics <ul style="list-style-type: none"> <li>●Sub-game perfection and Bayes-Nash equilibrium</li> <li>●Repeated games</li> </ul>	Bary Pradelski
	PROBLEM SET 1	
6) 26.03.	Game theory: evolution <ul style="list-style-type: none"> <li>●Evolutionary game theory</li> <li>●Algorithms in computer science (Price of anarchy)</li> </ul>	Bary Pradelski



# Finally, let's play again!

You remember the game:

- ① Choose a number between 0 and 100
  - new link...
- ② The player with the number that is closest to half the average wins  
.... 10CHF...

THANKS EVERYBODY

See you next week!

and keep checking the website for new materials as we progress:

[https://gametheory.online/project\\_show/32](https://gametheory.online/project_show/32)