

# Level K Thinking

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- Game theory: The study of strategic decision making
  - Your outcome depends on your own actions and the actions of others
- Standard tool for prediction: Nash Equilibrium
  - No player has incentive to deviate given the actions of others
- But Nash Equilibrium has some problems
  - Play of experimental subjects systematically violate its predictions
  - Can be very complex to calculate
    - Assumes a high degree of rationality on the part of subject
    - Assumes that THEY assume a high degree of rationality on the part of others
- Level K model tries to deal with both of these problems

## An Example: The $p$ Beauty Contest Game

- $n$  players
- Each player chooses  $s_i \in \{1, 2, \dots, 100\} = S_i$
- Earn \$10 if you are closest to  $p$  times average choice

$$s_i \in \arg \min_{s_1, \dots, s_n} |s_j - p \frac{\sum_{k=1}^n s_k}{n}|$$

- Earn zero otherwise
  - Split the prize in event of the tie
- $p \in (0, 1)$
- This defines  $u_i(s_i, \{s_1, \dots, s_{i-1}, s_{i+1}, \dots, s_n\}) = u(s_i, s_{-i})$ 
  - The utility if you play  $s_i$  and others play  $s_{-i}$

# Nash Equilibrium

- Nash Equilibrium: A strategy profile  $\{s_1^*, \dots, s_n^*\}$  such that no player has an incentive to deviate

$$u(s_i^*, s_{-i}^*) \geq u(s, s_{-i}^*) \quad \forall s \in S_i$$

- What is the Nash Equilibrium of the p-beauty contest game?
- The (almost) unique Nash equilibrium is  $s_i^* = 1 \quad \forall i$ 
  - No gain by deviating for any player
  - For any other strategy profile, any player with  $s_i \geq \frac{\sum_{k=1}^n s_k}{n}$  has incentive to deviate

# Nash Equilibrium

- Do people play Nash Equilibrium strategies?
- Makes strong rationality assumptions
  - That players can figure out what the Nash Equilibrium is
  - They assume that others can figure out what the Nash equilibrium is
- Nash Equilibria may also come about through a process of learning
  - We will focus on one shot games

## Depth of Reasoning

- Consider the following sequence of reasoning for the  $\frac{2}{3}$  beauty contest
  - I think the other players will play 50, so I will play the best response to 50, i.e  $33\frac{1}{3}$
  - I think the other players think everyone will play 50 and so will play  $33\frac{1}{3}$ . I will therefore play the best response to this, i.e.  $22\frac{2}{9}$
  - I think that the other players will initially think that everyone will play 50, and will consider playing  $33\frac{1}{3}$ . However, they will think that others have done the same reasoning, and will therefore play  $22\frac{2}{9}$ . I will best respond to this and play  $14\frac{22}{27}$
  - .....

# Depth of Reasoning

- More generally (in the case of two players)
  - ① I assume that the other player will play  $\bar{s}$ , so I will play  $s_i^1 \in \arg \max_{s \in S_i} u_i(s, \bar{s})$
  - ② I assume that other players will best respond to  $\bar{s}$  and so play  $s_j^1 \in \arg \max_{s \in S_j} u_j(s, \bar{s})$ . I will therefore play  $s_i^2 \in \arg \max_{s \in S_i} u_i(s, s_j^1)$
  - ③ I assume that other players will best respond to  $s_j^1$  and so play  $s_j^2 \in \arg \max_{s \in S_j} u_j(s, s_i^1)$ . I will therefore play  $s_i^3 \in \arg \max_{s \in S_i} u_i(s, s_j^2)$

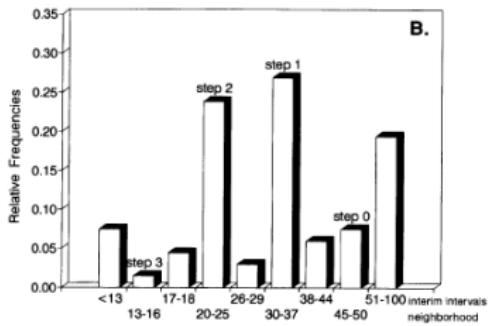
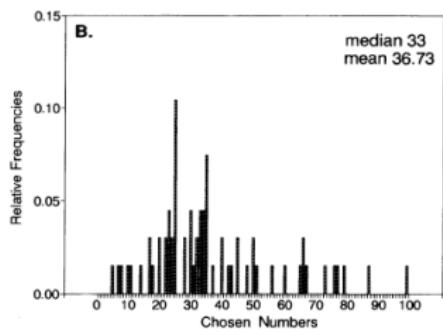
## Depth of Reasoning

- Notice that a Nash equilibrium is a *fixed point* of this type of reasoning
  - I assume that other players will best respond to  $s_i^*$  and so play  $s_j^* \in \arg \max_{s \in S_j} u_j(s, s_i^*)$ . I will therefore play  $s_i^* \in \arg \max_{s \in S_i} u_i(s, s_j^*)$
- In the case of the  $p$ -beauty contest game this type of reasoning will *converge* to the Nash Equilibrium
  - This is not always true

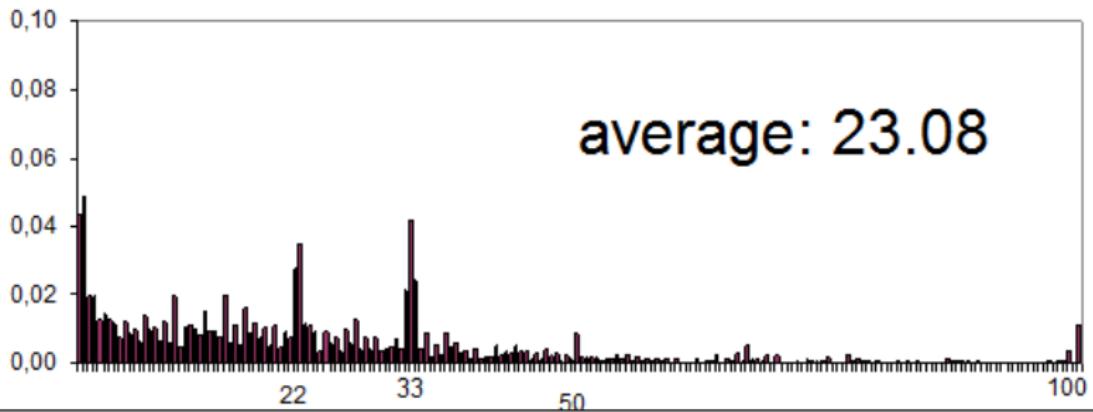
- What if you are constrained in how many steps of this type of reasoning that you can do?
- You have a ‘type’ equal to the
  - Level 0: Non-strategic (play at random)
  - Level 1: Best respond to level 0
  - Level 2: Best respond to level 1
  - Level 3: Best respond to level 2
  - ...
- There is a distribution of types in the population:  $\pi_i$ ; probability of level i
- Generally assumed that  $\pi_i = 0$ 
  - ‘Anchor’ for remaining levels

# Level-K Thinking

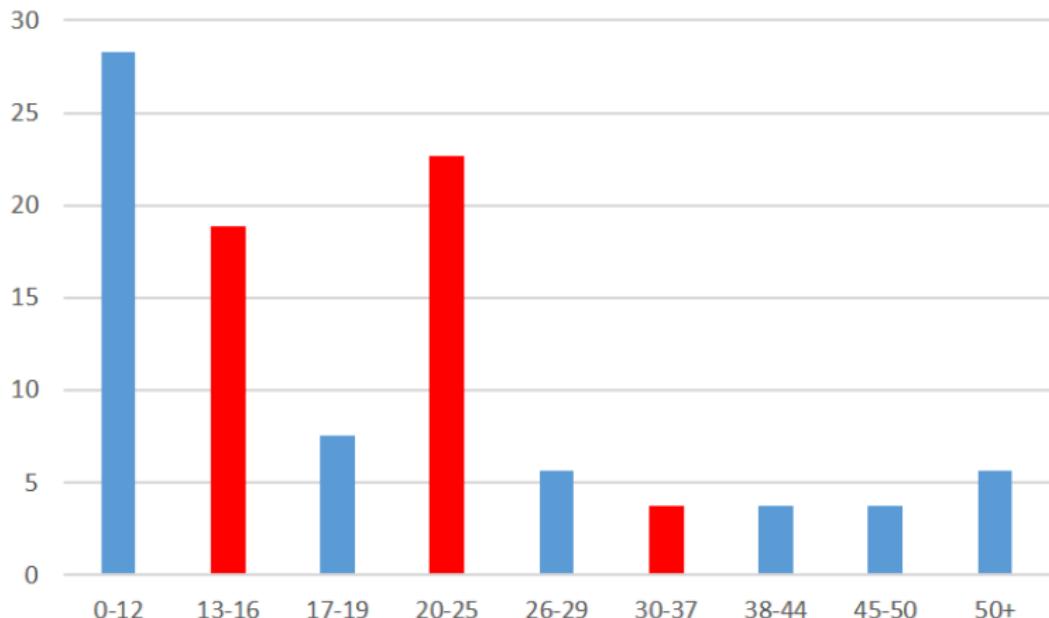
- What would this imply for the data in the  $\frac{2}{3}$  beauty contest game?
- We would see a focus of responses at the following levels:
  - $\pi_0 : 50$
  - $\pi_1 : 33\frac{1}{3}$
  - $\pi_2 : 22\frac{2}{9}$
  - $\pi_3 : 14\frac{22}{27}$



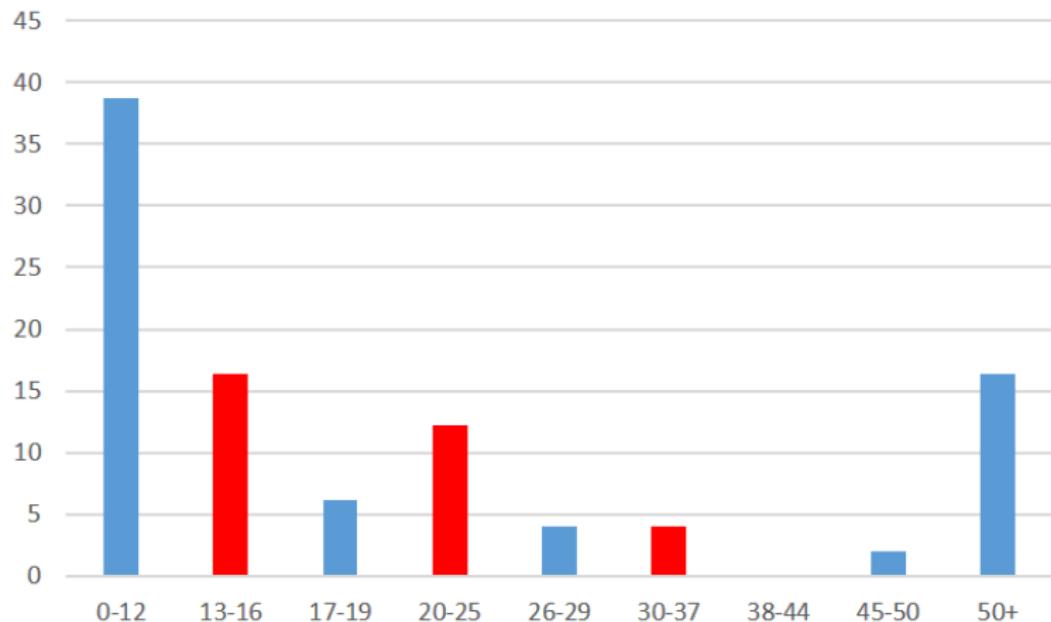
## 3 Newspaper experiments (Spektrum, Financial Times, Expansion)



# Data from my Last Class at Brown



# Your Data



- You are much more 'rational' than the Nagel sample
  - Class mean 23.5 vs 36.7 in the Nagel Data
  - Brown Students: 22.6
- Many more 'Nash' players
  - But also more 'high' players
- Some evidence that there are a number of level 3 players
  - 7 players played 22
- 2/3 of the mean: 15.7
- Winning guess
  - Zoey Chopra
  - Pranav Balan
  - Shambhavi Tiwari
  - Ahana Maken

## Issues with Level K Model

- Lots of additional degrees of freedom
  - What is level 0?
  - What is the distribution of types?
- The model has low predictive power
  - Consistent with any choice pattern
  - Needs more (ad hoc) assumptions in order to constrain it

## Issues with Level K Model

- Are types fixed?
- Should be able to use estimated type in one game to predict play in others
- Georganas et al [2013] get same subject to play ‘undercutting’ and ‘guessing games’
- Estimate type in each case
- Find no correlation in estimated type or estimated rank

## Issues with Level K Model

- Response to learning and incentives?
- There is also evidence that types change predictably
  - Nagel [1995] - bidding in the  $p$ -beauty contest game falls with experience
  - Alaoui and Penta [2013] - subjects change their level of play with incentives