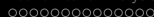


# A Window of Cognition: Eyetracking the Decision-Making Process in Graphical Beauty Contest Games

Chun-Ting Chen, Chen-Ying Huang, Joseph Tao-yi Wang

2008.6.2



# Focus

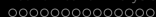
- Most theories only make predictions on choices. Most experiments only verify theories by observing choices.
  - We propose a new set of games, the **Graphical Beauty Contest Games**.
  - Using eyetracking, we base on a **Level- $k$  model** to analyze subjects' choices and lookups in these games.

# Focus

- Most theories only make predictions on choices. Most experiments only verify theories by observing choices.
  - We propose a new set of games, the **Graphical Beauty Contest Games**.
  - Using eyetracking, we base on a **Level- $k$  model** to analyze subjects' choices and lookups in these games.

# Focus

- Since lookups are observed, our study is different from most experiments where only choices are analyzed.
- Moreover, due to the graphical nature of the games, the way lookups are used in our study has a very natural interpretation based on the sequence of best-responding of a Level- $k$  model.



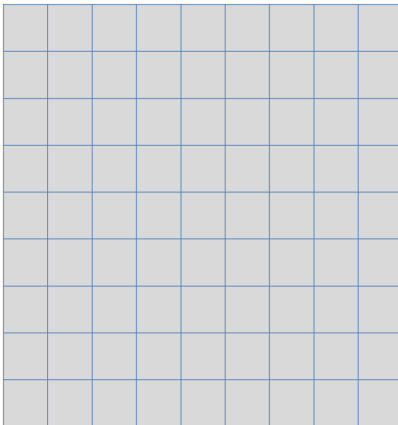
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# Graphical Beauty Contest Game

**Member A**

LEFT 2

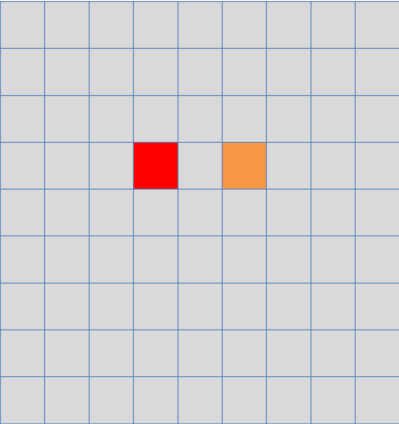


**Member B**

BELOW 4

# Graphical Beauty Contest Game

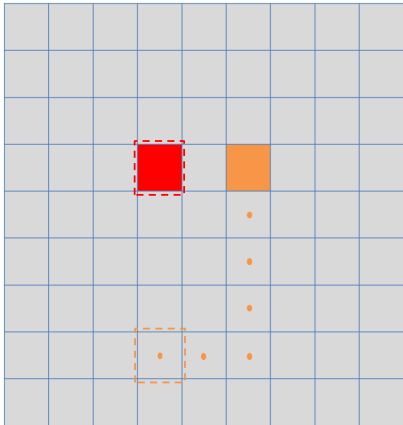
**Member A**  
LEFT 2



**Member B**  
BELOW 4

# Graphical Beauty Contest Game

**Member A**  
LEFT 2

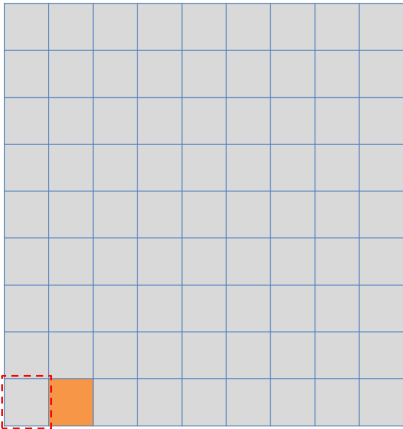


**Member B**  
BELOW 4



# Graphical Beauty Contest Game

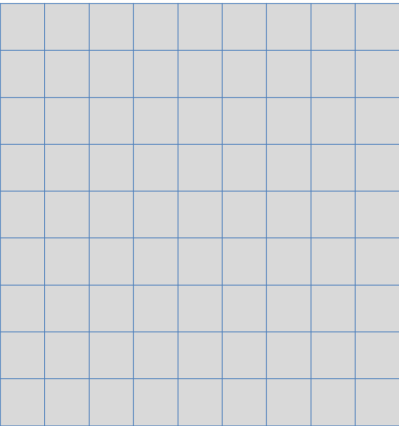
**Member A**  
LEFT 2



**Member B**  
BELOW 4

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**Member A**  
LEFT 2

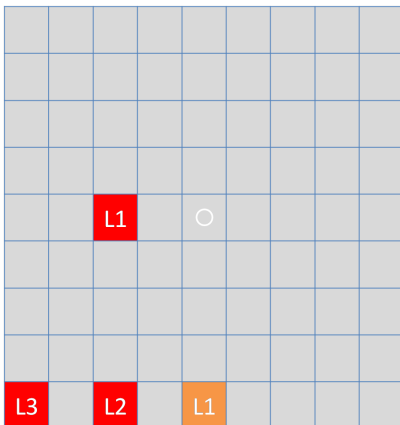


**Member B**  
BELOW 4

# Level-k classification

**Member A**

LEFT 2

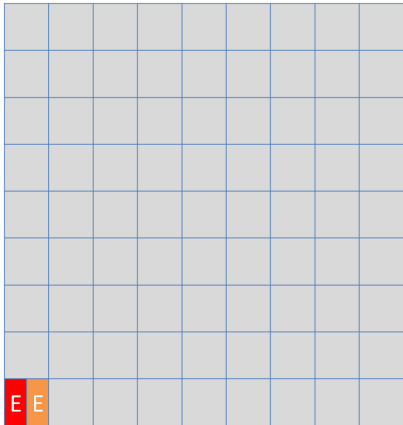


**Member B**

BELOW 4

# Level-k classification

**Member A**  
LEFT 2



**Member B**  
BELOW 4

# Lookup behavior assumption

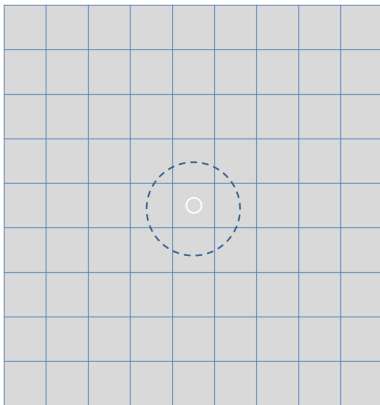
- Lookups will follow the sequence of best-responding implied by a Level-k model.

Assumption

# Level 0's Lookup behavior (central point)

**Member A**

LEFT 2

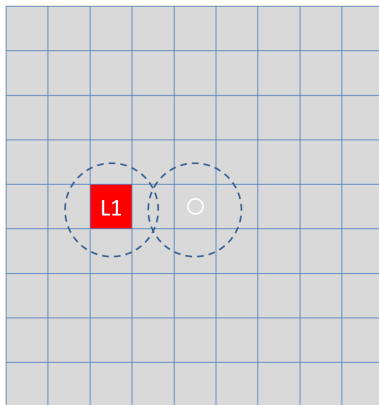
**Member B**

BELOW 4

# Level 1's Lookup behavior

**Member A**

LEFT 2



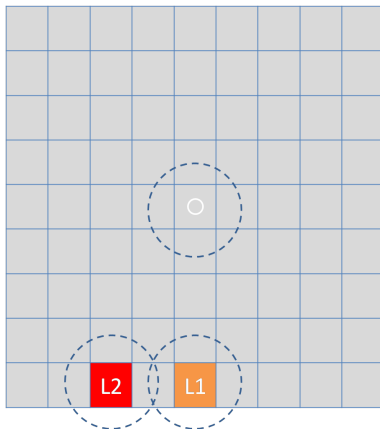
**Member B**

BELOW 4

# Level 2's Lookup behavior

**Member A**

LEFT 2



**Member B**

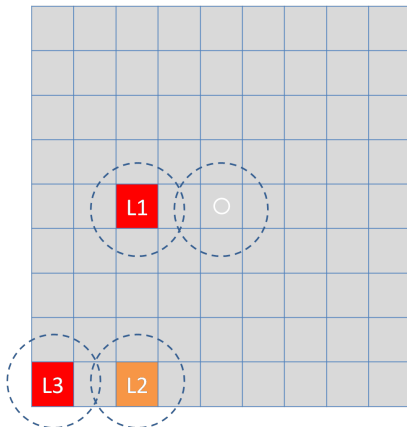
BELOW 4



# Level 3's Lookup behavior

**Member A**

LEFT 2



**Member B**

BELOW 4

# Lookup behavior assumption

- Lookups will follow the sequence of best-responding implied by a Level-k model.
  - 1 But we don't assume lookups will follow this precise order in time.
  - 2 We assume each lookup corresponds to a state, so that the entire sequence of lookups constitutes a *state-switching* process.

# Lookup behavior assumption

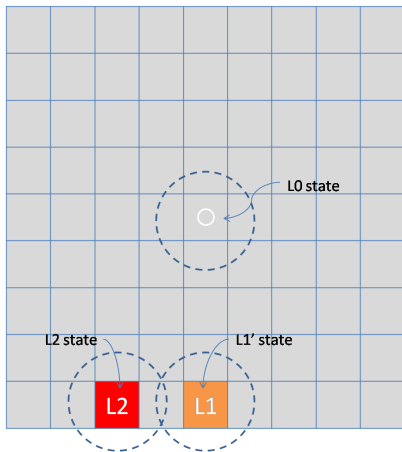
- Lookups will follow the sequence of best-responding implied by a Level-k model.
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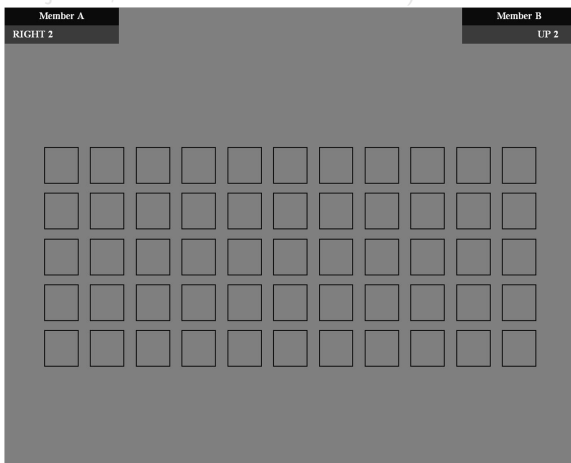
# State switching

- State switching: L2 as an example



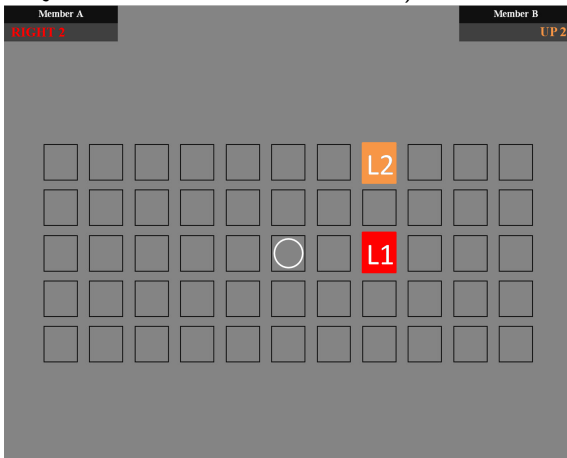
# State switching

- An empirical sequence of lookups (Round 15 of Subject 9, who is classified as an L2).



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# Markov switching

- State Transition Matrix

Lower level ←————→ Higher level

	$L0$	$L1'$	$L2$
$L0$	0.92	0.04	0.04
$L1'$	0.05	0.92	0.02
$L2$	0.01	0.01	0.98

Note: Subject 9's estimated State Transition Matrix

# Markov Transition Matrix property

We define the *UL ratio* to see whether states transit from lower levels to higher levels.

	$L0$	$L1'$	$L2$
$L0$	0.94	0.05	0.01
$L1'$	0.05	0.90	0.06
$L2$	0.03	0.02	0.95

$U/L = 0.12/0.10 > 1$

Note: Subject 9's estimated UL ratio

# Markov Transition Matrix property

## ● UL ratio

<i>subject</i>	<i>adjusted type</i>	<i>UL ratio</i>
12	L1	28183.0
8	L3	13.2
11	L3	3.5
15	L1	3.3
13	L3	3.0
6	L2	2.8
3	L3	2.6
14	L3	2.1
17	L3	2.0
1	L3	1.8
2	L2	1.4
5	L2	1.3
9	L2	1.1
4	L3	0.6
10	L3	0.3
16	L2	0.1
7	L0	-

## Result

- The result suggests that states underlying lookups do transit from lower levels to higher levels.

# The classification based on lookups+Hensen's LR Test

<i>subject</i>	<i>Lk*</i>	<i>Lk*</i>				<i>adjusted type</i>
		L0	L1	L2	L3	
7	L2	0.067	0.035 *	-	-	L0
5	L2	0.006 *	0.005 *	-	-	L2
9	L2	0.002 *	0.017 *	-	-	L2
12	L3	0.000 *	0.130	0.000 *	-	L1
15	L3	0.000 *	0.058	0.000 *	-	L3
2	L3	0.000 *	0.001 *	0.327	-	L2
6	L3	0.000 *	0.000 *	0.413	-	L2
16	L3	0.000 *	0.001 *	0.227	-	L2
1	L3	0.000 *	0.000 *	0.000 *	-	L3
3	L3	0.010 *	0.016 *	0.014 *	-	L3
4	L3	0.000 *	0.036 *	0.003 *	-	L3
8	L3	0.000 *	0.001 *	0.001 *	-	L3
10	L3	0.000 *	0.000 *	0.000 *	-	L3
11	L3	0.000 *	0.000 *	0.017 *	-	L3
13	L3	0.000 *	0.000 *	0.000 *	-	L3
14	L3	0.000 *	0.013 *	0.000 *	-	L3
17	L3	0.030 *	0.039 *	0.001 *	-	L3

\* indicates  $p$ -value less or equal than 0.05

## Result

- 12/17 subjects can be strongly classified ( $p$ -value  $\leq 0.05$ ).
- 5/17 subjects are adjusted to lower level- $k$  types with second highest maximum likelihood.

# The classification based on choice + Hensen's LR Test

subject	Lk*	Lk*-			
		L0	L1	L2	L3
7	L0	-	0.105	0.143	<b>0.100</b>
9	L0	-	0.191	<b>0.418</b>	0.313
4	L1	0.172	-	<b>0.152</b>	0.129
10	L1	<b>0.049*</b>	-	<b>0.047*</b>	<b>0.051</b>
12	L1	<b>0.050*</b>	-	0.101	<b>0.074</b>
17	L1	0.083	-	0.088	<b>0.184</b>
2	L2	0.097	0.087	-	<b>0.142</b>
6	L2	0.055	0.085	-	<b>0.141</b>
11	L2	0.054	0.069	-	<b>0.387</b>
16	L2	<b>0.045*</b>	0.053	-	<b>0.081</b>
1	L3	0.061	0.070	<b>0.081</b>	-
3	L3	0.126	<b>0.403</b>	0.111	-
5	L3	0.066	0.070	<b>0.232</b>	-
8	L3	0.069	0.083	<b>0.095</b>	-
13	L3	0.053	0.111	<b>0.098</b>	-
14	L3	0.052	<b>0.221</b>	0.064	-
15	L3	0.084	0.111	<b>0.217</b>	-

## Result

- No subjects can be strongly classified ( $p\text{-value} \leq 0.05$ ).

# Hensen's LR Test for Classification: Choices vs. Lookup

<i>subject</i>	<i>Lk based on Lookups</i>	<i>Lk based on Choice only</i>	<i>H0: Choice is true H1: Lookups is true</i>	<i>H0: Lookups is true H1: Choice is true</i>
1	L3	L3	-	-
2	L2	L2	-	-
3	L3	L3	-	-
4	L3	L1	0.036**	0.129
5	L2	L3	0.000**	0.232
6	L2	L2	-	-
7	L0	L0	-	-
8	L3	L3	-	-
9	L2	L0	0.001**	0.418
10	L3	L1	0.000**	0.051*
11	L3	L2	0.017**	0.387
12	L1	L1	-	-
13	L3	L3	-	-
14	L3	L3	-	-
15	L3	L3	-	-
16	L2	L2	-	-
17	L3	L1	0.039**	0.184

\*\* indicates  $p$ -value less or equal than 0.05; \* indicates  $p$ -value less or equal than 0.1

## Result

- 11/17 subjects' lookups agree with choices.
- 6/17 subjects' lookups do not agree with choices, but the classification according to lookups passes the LR test ( $p$ -value  $\leq 0.05$ ) that maximum likelihoods are significantly different from those estimated by choices.

# Conclusion

- 1 We estimate a Markov Switching Transition Matrix from empirical lookups.
- 2 11/17 subject's lookups agree with choices.
- 3 when the two classifications disagree, choice data alone could not reject nearly all of the lookup-based type alternatives, while most of the choice-based type alternatives could be rejected using lookup data.

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