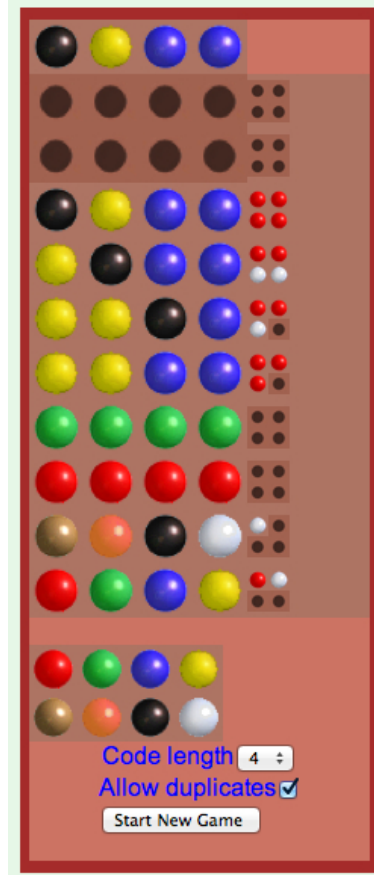


# Critical Tests Among Models of Risky Decision Making

Michael H. Birnbaum  
Konstanz, September, 2019



# Critical Test



# Critical Tests are Theorems of One Model that are Violated by Another Model

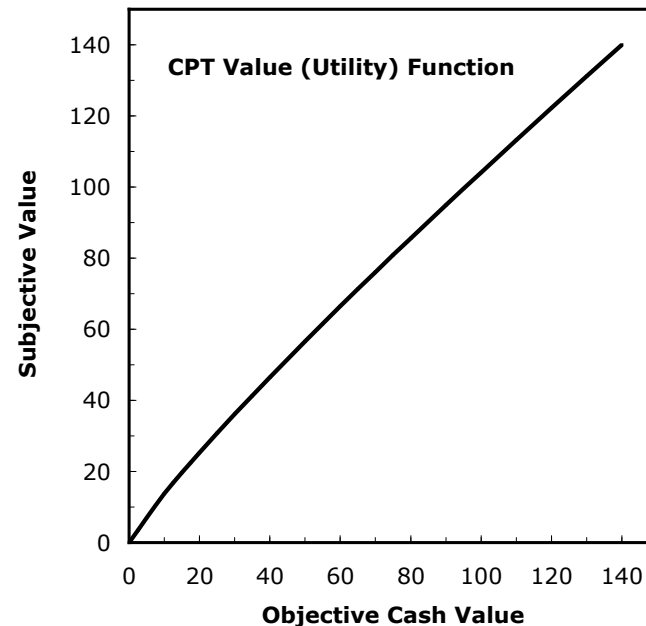
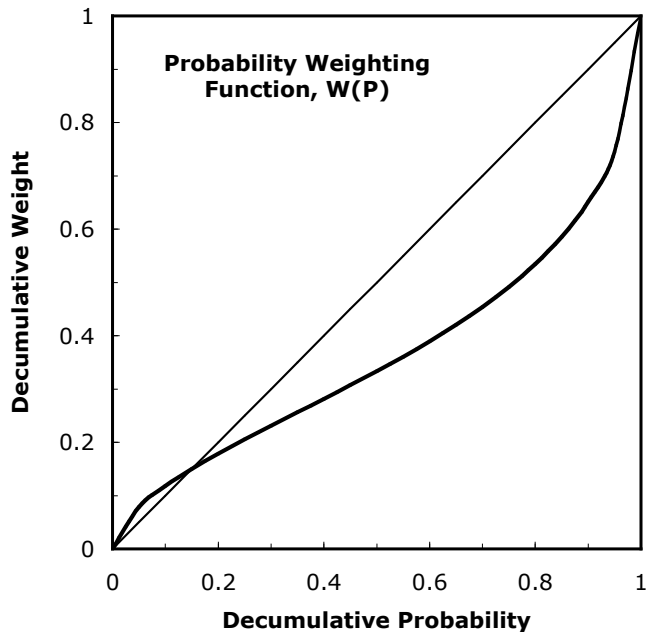
- This approach has advantages over tests or comparisons of fit.
- It is not the same as “axiom testing.”
- Use model-fitting to rival model to predict where to find violations of theorems deduced from model tested.

# Outline

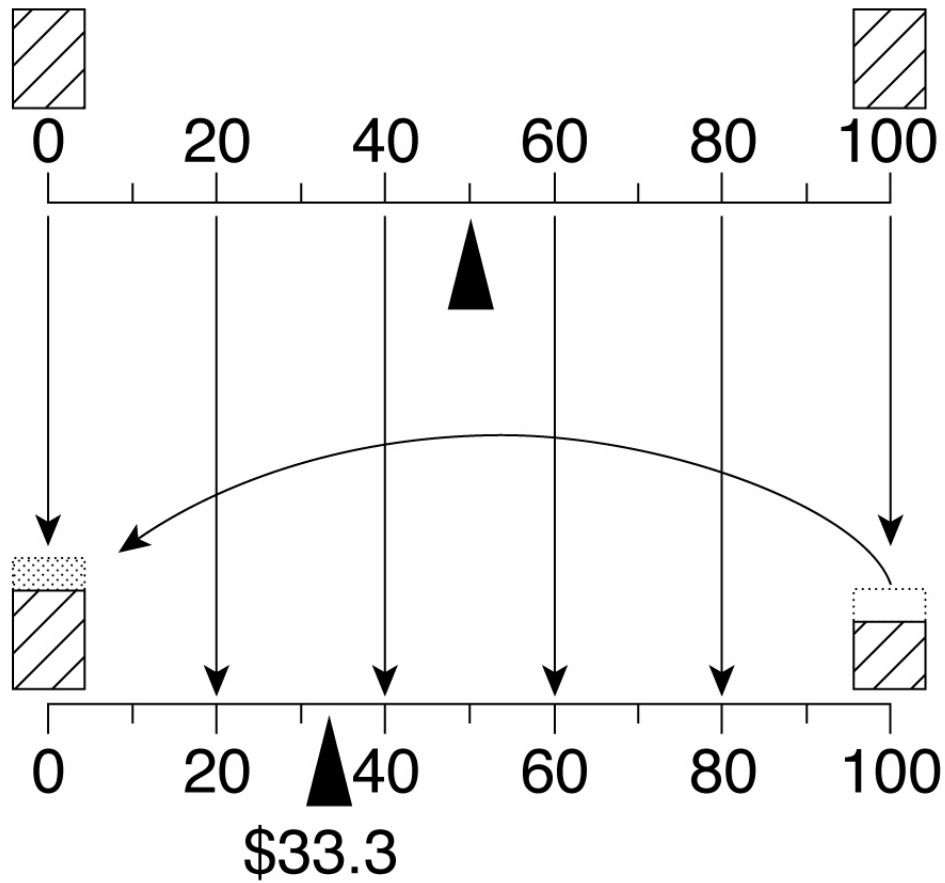
- I will discuss critical properties that test between nonnested theories: CPT and TAX.
- Lexicographic Semiorders vs. family of transitive, integrative models (including CPT and TAX).
- Integrative Contrast Models (e.g., Regret, Majority Rule) vs. transitive, integrative models.

# Cumulative Prospect Theory/ Rank-Dependent Utility (RDU)

$$CPU(G) = \sum_{i=1}^n [W(\sum_{j=1}^i p_j) - W(\sum_{j=1}^{i-1} p_j)] u(x_i)$$



# TAX Model



# “Prior” TAX Model

Assumptions:  $G = (x, p; y, q; z, 1 - p - q)$

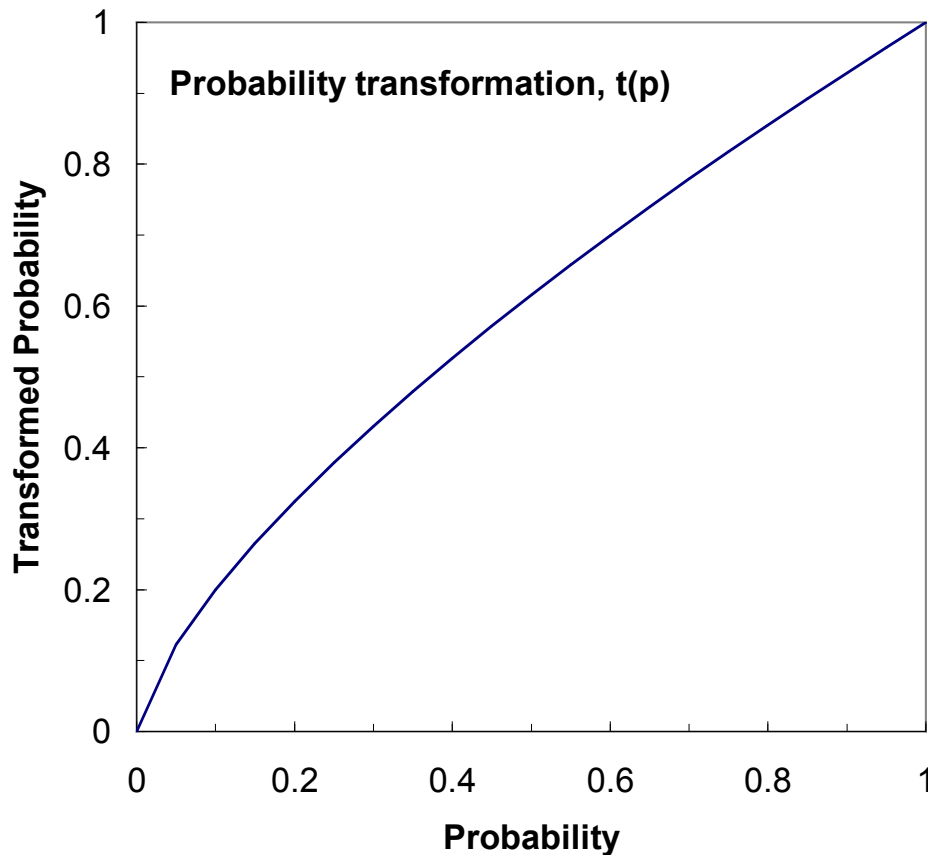
$$U(G) = \frac{Au(x) + Bu(y) + Cu(z)}{A + B + C}$$

$$A = t(p) - \delta t(p)/4 - \delta t(p)/4$$

$$B = t(q) - \delta t(q)/4 + \delta t(p)/4$$

$$C = t(1 - p - q) + \delta t(p)/4 + \delta t(q)/4$$

# TAX Parameters



For  $0 < x < \$150$

$$u(x) = x$$

Gives a decent approximation.  
Risk aversion produced by  $\delta$ .

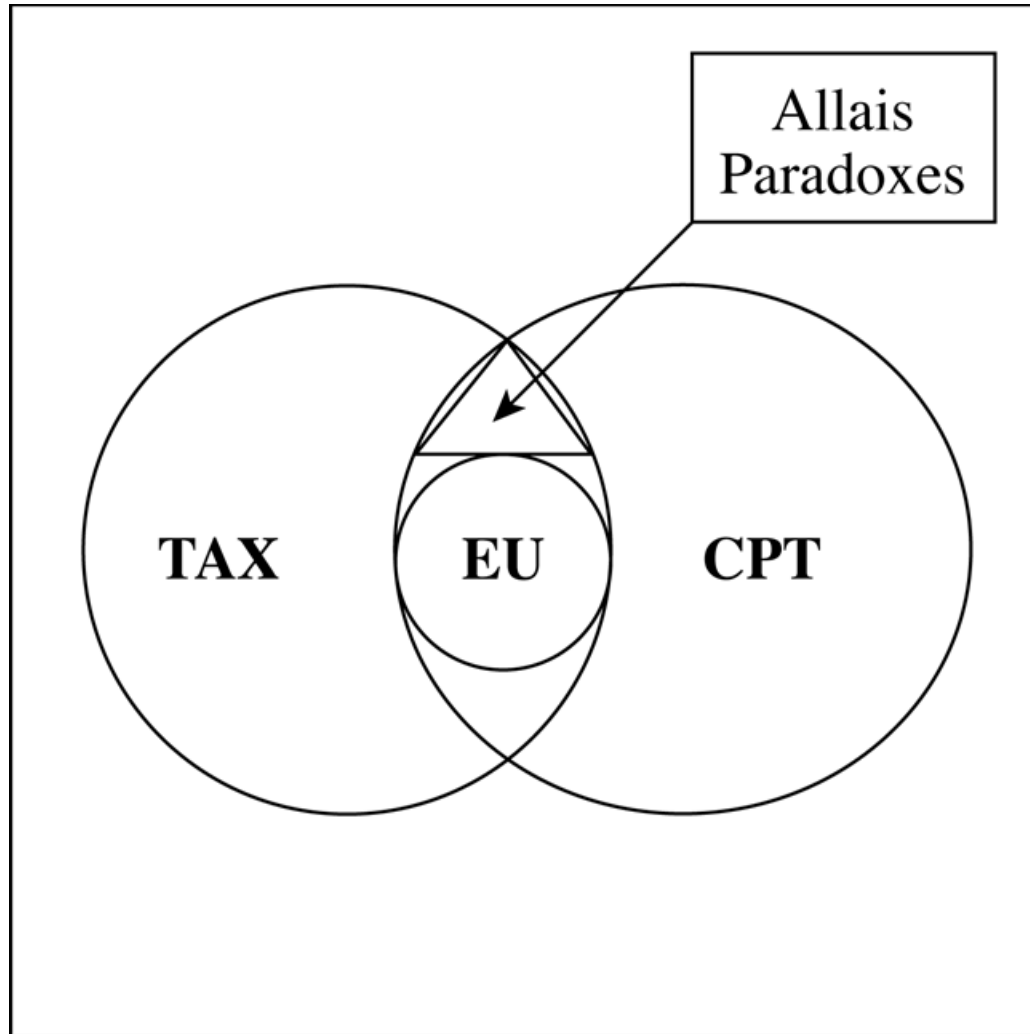
$$\delta = 1.$$



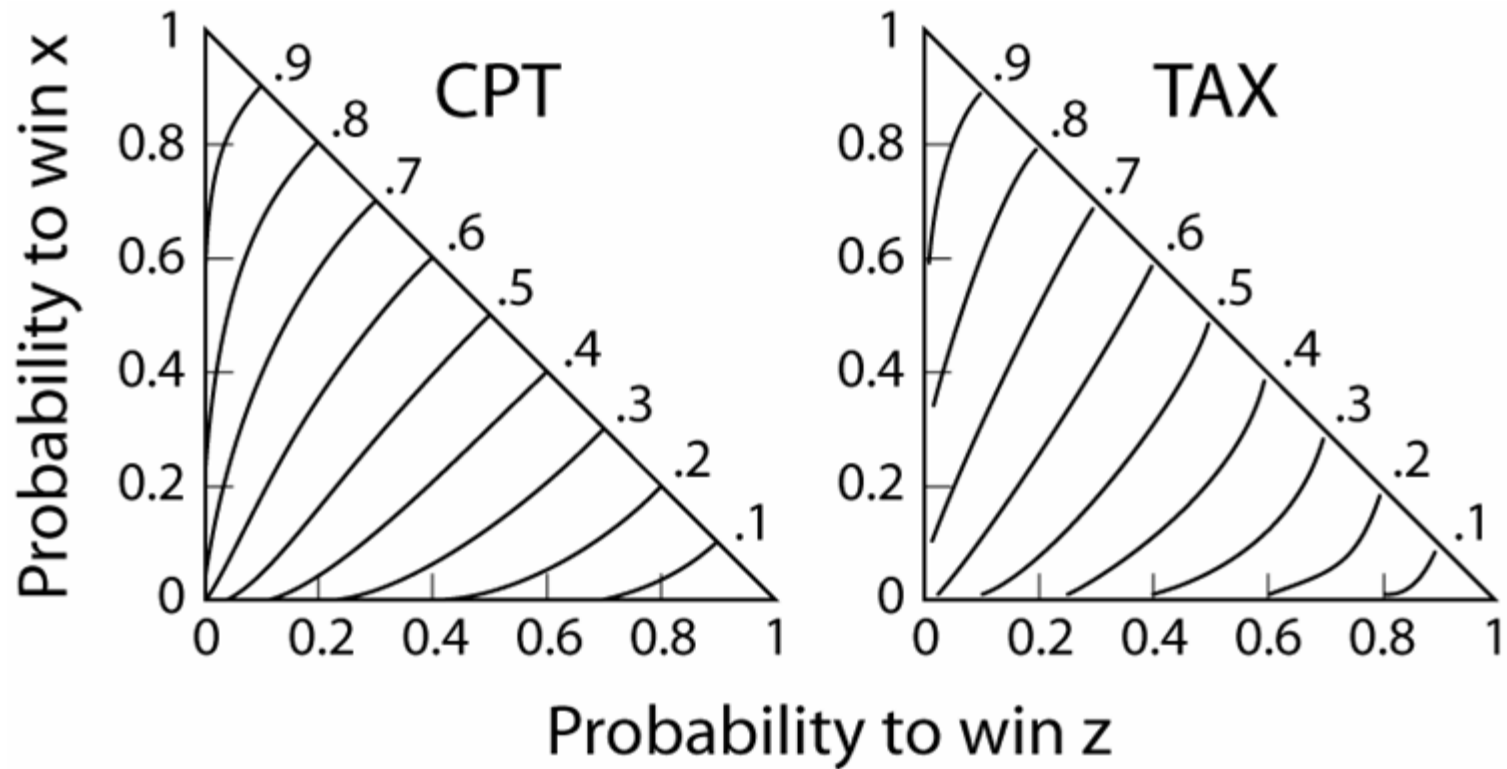
# TAX and CPT nearly identical for binary (two-branch) gambles

- $CE(x, p; y)$  is an inverse-S function of  $p$  according to BOTH TAX and CPT, given their typical parameters.
- Therefore, there is little point trying to distinguish these models with binary gambles.

# Non-nested Models



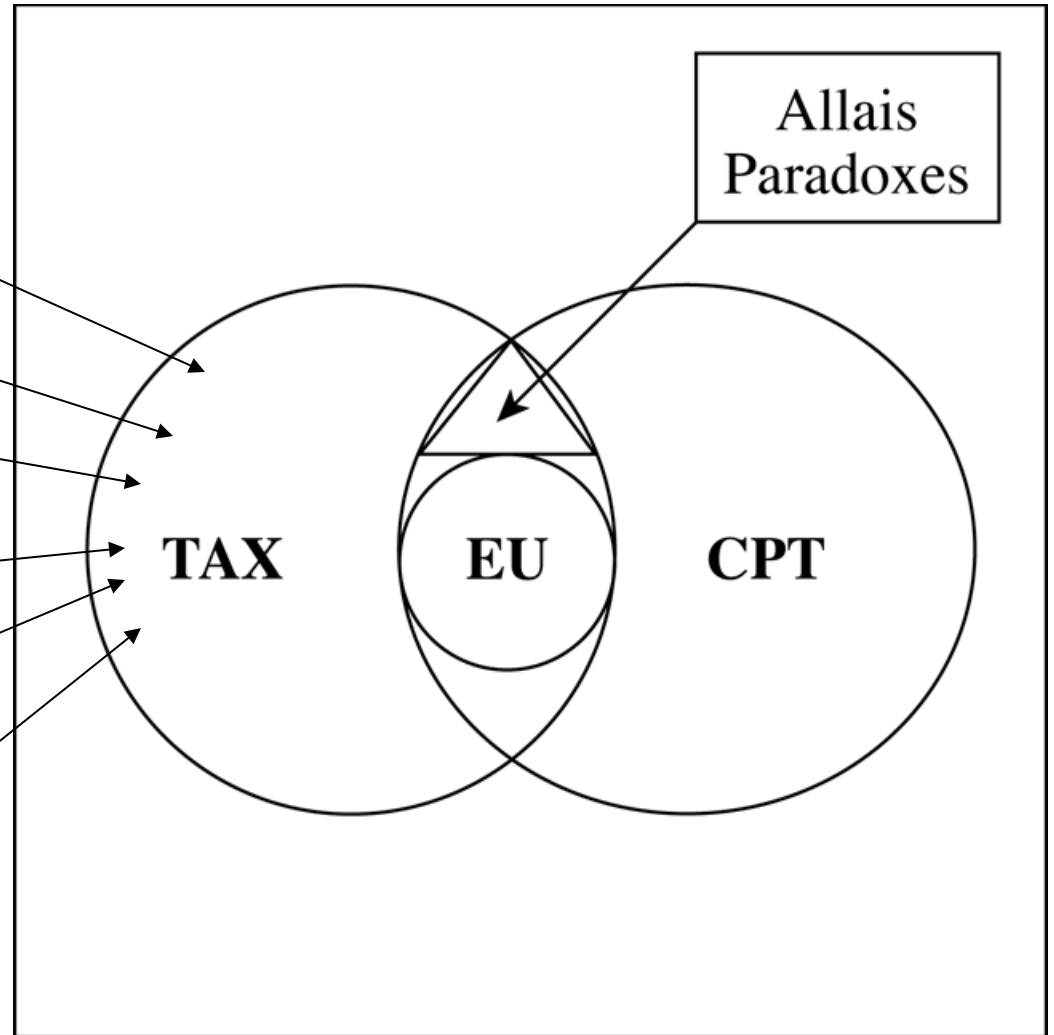
# CPT and TAX nearly identical inside the prob. simplex



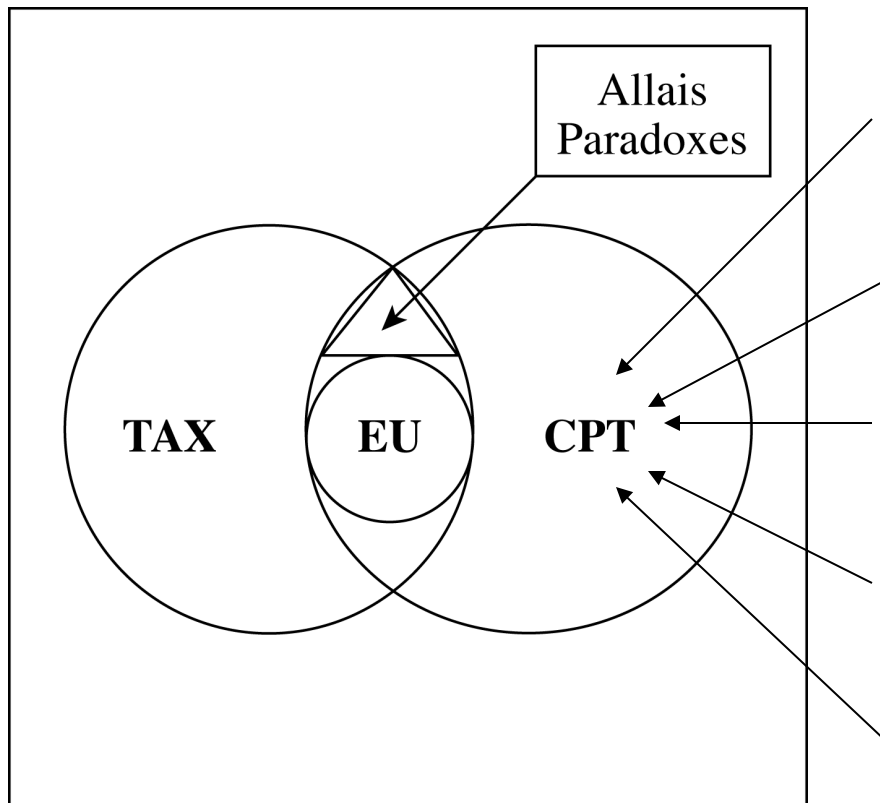
# Testing CPT

TAX: Violations of:

- Coalescing
- Stochastic Dominance
- Lower Cum. Independence
- Upper Cumulative Independence
- Upper Tail Independence
- Gain-Loss Separability



# Testing TAX Model



CPT: Violations of:

- 4-Distribution Independence ( $RS'$ )
- 3-Lower Distribution Independence
- 3-2 Lower Distribution Independence
- 3-Upper Distribution Independence ( $RS'$ )
- Res. Branch Indep ( $RS'$ )

# Stochastic Dominance

- A test between CPT and TAX:

$$G = (x, p; y, q; z) \text{ vs. } F = (x, p - s; y', s; z)$$

Note that this recipe uses 4 distinct consequences:  $x > y' > y > z > 0$ ; outside the probability simplex defined on three consequences.

CPT  $\Rightarrow$  choose  $G$ , TAX  $\Rightarrow$  choose  $F$

Test if violations due to “error.”

# Error Model Assumptions

- Each choice pattern in an experiment has a true probability,  $p$ , and each choice has an error rate,  $e$ .
- The error rate is estimated from inconsistency of response to the same choice by same person over repetitions. The “true”  $p$  is then estimated from consistent (repeated) responses to same question.

# Violations of Stochastic Dominance

A: 5 tickets to win \$12  
5 tickets to win \$14  
90 tickets to win \$96

B: 10 tickets to win \$12  
5 tickets to win \$90  
85 tickets to win \$96

122 Undergrads: 59% TWO violations (BB)

28% Pref Reversals (AB or BA)

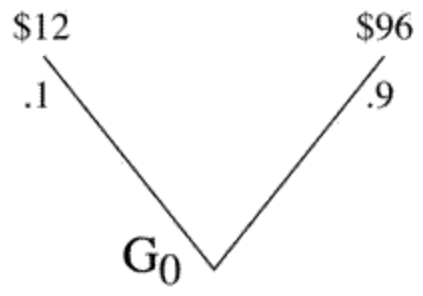
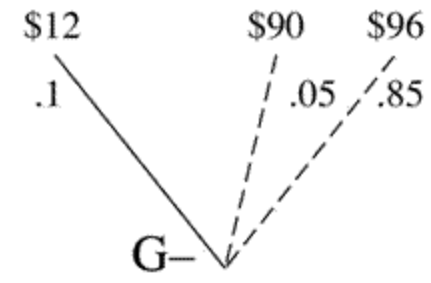
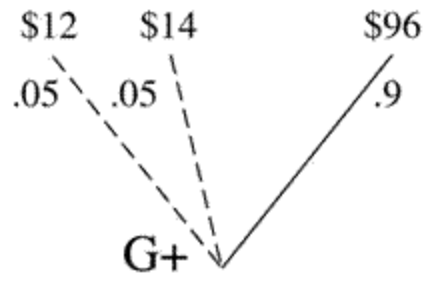
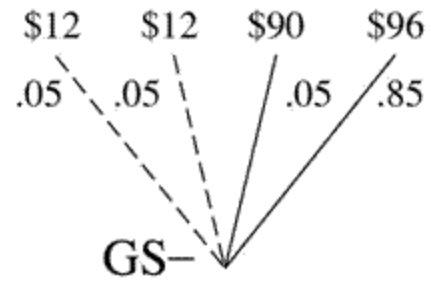
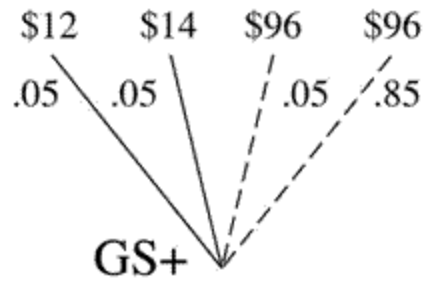
Estimates:  $e = 0.19$ ;  $p = 0.85$

170 Experts: 35% repeated violations

31% Reversals

Estimates:  $e = 0.20$ ;  $p = 0.50$





# 42 Studies of Stochastic Dominance, $n = 12,152$

- Large effects of splitting vs. coalescing of branches
- Small effects of education, gender, study of decision science
- Very small effects of 15 probability formats and request to justify choices.
- Miniscule effects of event framing (framed vs unframed)

# Allais Paradox Dissection

	Restricted Branch Independence	
Coalescing	Satisfied	Violated
Satisfied	EU, PT*, CPT*	CPT
Violated	PT	TAX

# Summary: Prospect Theories not Descriptive

- Violations of Coalescing
- Violations of Stochastic Dominance
- Violations of Gain-Loss Separability
- Dissection of Allais Paradoxes: viols of coalescing and restricted branch independence; RBI violations opposite of Allais paradox; opposite CPT.

## Results: CPT makes wrong predictions for all 12 tests

- Can CPT be saved by using different formats for presentation?
- Violations of coalescing, stochastic dominance, lower and upper cumulative independence replicated with 14 different formats and thousands of participants.
- See Birnbaum, Psych Review 2008, & papers 2008-2017 in JDM.

# Lexicographic Semiorders

- Intransitive Preference.
- Priority heuristic of Brandstaetter, Gigerenzer & Hertwig is a variant of LS, plus some additional features.
- In this class of models, people do not integrate information or have interactions such as the probability X prize interaction in family of integrative, transitive models (CPT, TAX, GDU, EU and others)

LPH LS:  $G = (x, p; y)$   $F = (x', q; y')$

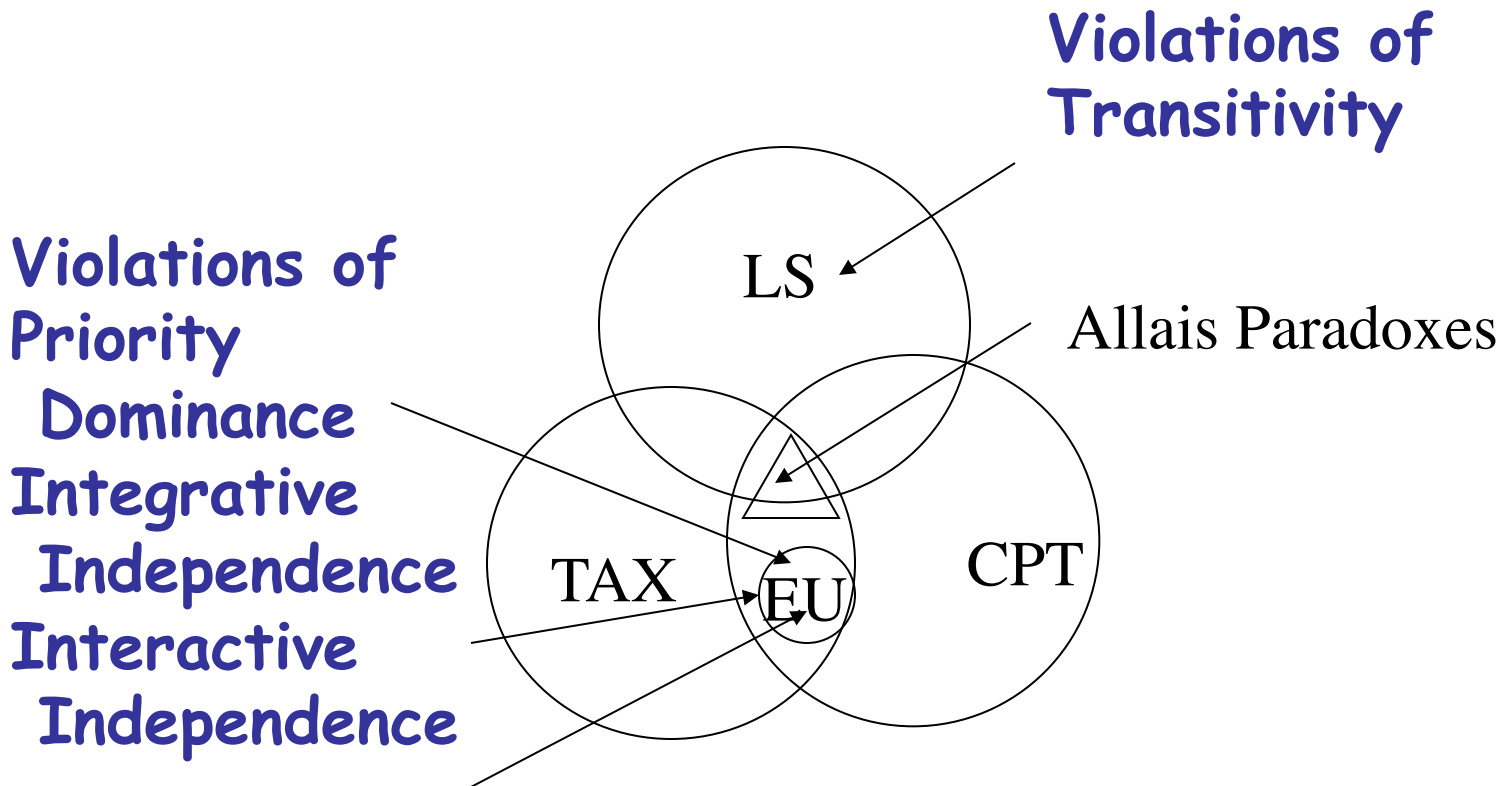
- If  $(y - y' > \Delta)$  choose  $G$
- Else if  $(y' - y > \Delta)$  choose  $F$
- Else if  $(p - q > \delta)$  choose  $G$
- Else if  $(q - p > \delta)$  choose  $F$
- Else if  $(x - x' > 0)$  choose  $G$
- Else if  $(x' - x > 0)$  choose  $F$
- Else choose randomly

# Family of LS

- In two-branch gambles,  $G = (x, p; y)$ , there are three dimensions:  $L$  = lowest outcome ( $y$ ),  $P$  = probability ( $p$ ), and  $H$  = highest outcome ( $x$ ).
- There are 6 orders in which one might consider the dimensions:  $LPH$ ,  $LHP$ ,  $PLH$ ,  $PHL$ ,  $HPL$ ,  $HLP$ .
- In addition, there are two threshold parameters (for the first two dimensions).



# Testing Lexicographic Semiorde Models



# New Critical Tests distinguishing family of LS from {TAX, CPT, EU}

- *Dimension Interaction*: Decision should be independent of any dimension that has the same value in both alternatives.
- *Dimension Integration*: indecisive differences cannot add up to be decisive.
- *Priority Dominance*: if a difference is decisive, no effect of other dimensions.

# Taxonomy of choice models

	Transitive	Intransitive
<i>Interactive &amp; Integrative</i>	EU, CPT, TAX	Regret, Majority Rule
<i>Non-interactive &amp; Integrative</i>	Additive, CWA	Additive Diffs, SDM
<i>Not interactive or integrative</i>	1-dim.	LS, PH*

# Dimension Interaction

Risky	Safe	TAX	LPH	HPL
(\$95, <b>.1</b> ; \$5)	(\$55, <b>.1</b> ; \$20)	S	S	R
(\$95, <b>.99</b> ; \$5)	(\$55, <b>.99</b> ; \$20)	R	S	R

# Family of LS

- 6 Orders: LPH, LHP, PLH, PHL, HPL, HLP.
- There are 3 ranges for each of two parameters, making 9 combinations of parameter ranges.
- There are  $6 \times 9 = 54$  LS models.
- But all models predict SS, RR, or ??.

## Results: Interaction $n = 153$

Risky	Safe	% Safe	Est. p
(\$95, <b>.1</b> ; \$5)	(\$55, <b>.1</b> ; \$20)	71%	.76
(\$95, <b>.99</b> ; \$5)	(\$55, <b>.99</b> ; \$20)	17%	.04

# Analysis of Interaction

- Estimated probabilities:
- $P(SS) = 0$  (prior PH)
- $P(SR) = 0.75$  (prior TAX)
- $P(RS) = 0$
- $P(RR) = 0.25$
- Priority Heuristic: Predicts SS

# Probability Mixture Model

- Suppose each person uses a LS on any trial, but randomly switches from one order to another and one set of parameters to another.
- But any mixture of LS is a mix of SS, RR, and ???. So no LS mixture model explains SR or RS.



# Results: Dimension Integration

- Data strongly violate independence property of LS family
- Data are consistent instead with dimension integration. Two small, indecisive effects can combine to reverse preferences.
- Observed with all pairs of 2 dims.

# Studies of Transitivity

- LS models violate transitivity:  $A > B$  and  $B > C$  implies  $A > C$ .
- Birnbaum & Gutierrez (2007) tested transitivity using Tversky's gambles, using typical methods for display of choices.
- Text displays and pie charts with and without numerical probabilities. Similar results with all 3 procedures.

# Replication of Tversky ('69) with Roman Gutierrez

- 3 Studies used Tversky's 5 gambles, formatted with tickets and pie charts.
- Exp 1,  $n = 251$ , tested via computers.

# Three of Tversky's (1969) Gambles

- $A = (\$5.00, 0.29; \$0)$
- $C = (\$4.50, 0.38; \$0)$
- $E = (\$4.00, 0.46; \$0)$

Priority Heuristic Predicts:

$A$  preferred to  $C$ ;  $C$  preferred to  $E$ ,  
But  $E$  preferred to  $A$ . Intransitive.

TAX (prior):  $E > C > A$

# Response Combinations

Notation	(A, C)	(C, E)	(E, A)	
<b>000</b>	A	C	E	* PH
001	A	C	A	
010	A	E	E	
011	A	E	A	
100	C	C	E	
101	C	C	A	
110	C	E	E	TAX
<b>111</b>	C	E	A	*

# Results-ACE

pattern	Rep 1	Rep 2	Both
000 (PH)	10	21	5
001	11	13	9
010	14	23	1
011	7	1	0
100	16	19	4
101	4	3	1
110 (TAX)	176	154	133
111	13	17	3
sum	251	251	156

# Comments

- Results were surprisingly transitive.
- Differences: no pre-test, selection;
- Probability represented by # of tickets (100 per urn); similar results with pies.
- Regenwetter and colleagues: studies and new analyses (random utility definition of transitivity); they also conclude that evidence against transitivity is extremely weak.
- With Jeff Bahra: individual data also transitive

# Summary

- Priority Heuristic model's predicted violations of transitivity are rare.
- Dimension Interaction violates any member of LS models including PH.
- Dimension Integration violates any LS model including PH.
- Evidence of Interaction and Integration compatible with models like EU, CPT, TAX.
- Birnbaum, J. Mathematical Psych. 2010.



# Integrative Contrast Models

- Family of Integrative Contrast Models
- Special Cases: Regret Theory, Majority Rule (aka Most Probable Winner)
- Predicted Intransitivity: Forward and Reverse Cycles
- Birnbaum, M. H., & Diecidue, E. (2015). Testing a class of models that includes majority rule and regret theories: Transitivity, recycling, and restricted branch independence. *Decision*, 2, 145-190.

# Integrative, Interactive Contrast Models

$$A \succ B \Leftrightarrow \sum_{i=1}^n \phi(E_i) \psi(a_i, b_i)$$

$$A = (a_1, E_1; a_2, E_2; \dots; a_n, E_n)$$

$$B = (b_1, E_1; b_2, E_2; \dots; b_n, E_n)$$

## Assumptions

$$\psi(a_i, b_i) = -\psi(b_i, a_i)$$

$$\psi(a_i, b_i) = 0 \Leftrightarrow a_i = b_i$$

*Difference Model:*

$$\psi(a_i, b_i) = f[u(a_i) - u(b_i)]$$

# Special Cases

- Majority Rule (aka Most Probable Winner)
- Regret Theory
- Other models arise with different functions,  $f$ .

# Regret Aversion

$$\psi[a, c] \geq \psi[a, b] + \psi[b, c], \quad u(a) > u(b) > u(c)$$

# Regret Model

$$f[u(a) - u(b)] = |u(a) - u(b)|^\beta, \quad u(a) > u(b)$$

$$f[u(a) - u(b)] = -|u(a) - u(b)|^\beta, \quad u(b) > u(a)$$

$$\beta > 1$$

# Majority Rule Model

$$f[u(a) - u(b)] = \begin{cases} 1 & \text{if } u(a) > u(b) \\ 0 & \text{if } u(a) = u(b) \\ -1 & \text{if } u(a) < u(b) \end{cases}$$

# Predicted Intransitivity

- These models violate transitivity of preference
- Regret and MR cycle in opposite directions
- However, both REVERSE cycle under permutation over events; i.e., “juxtaposition.”



# Concrete Example

- Urn: 33 Red, 33 White, 33 Blue
- One marble drawn randomly
- Prize depends on color drawn.
- $A = (\$4, \$5, \$6)$  means win \$400 if Red, win \$500 if White, \$600 if Blue. (Study used values  $\times 100$ ).

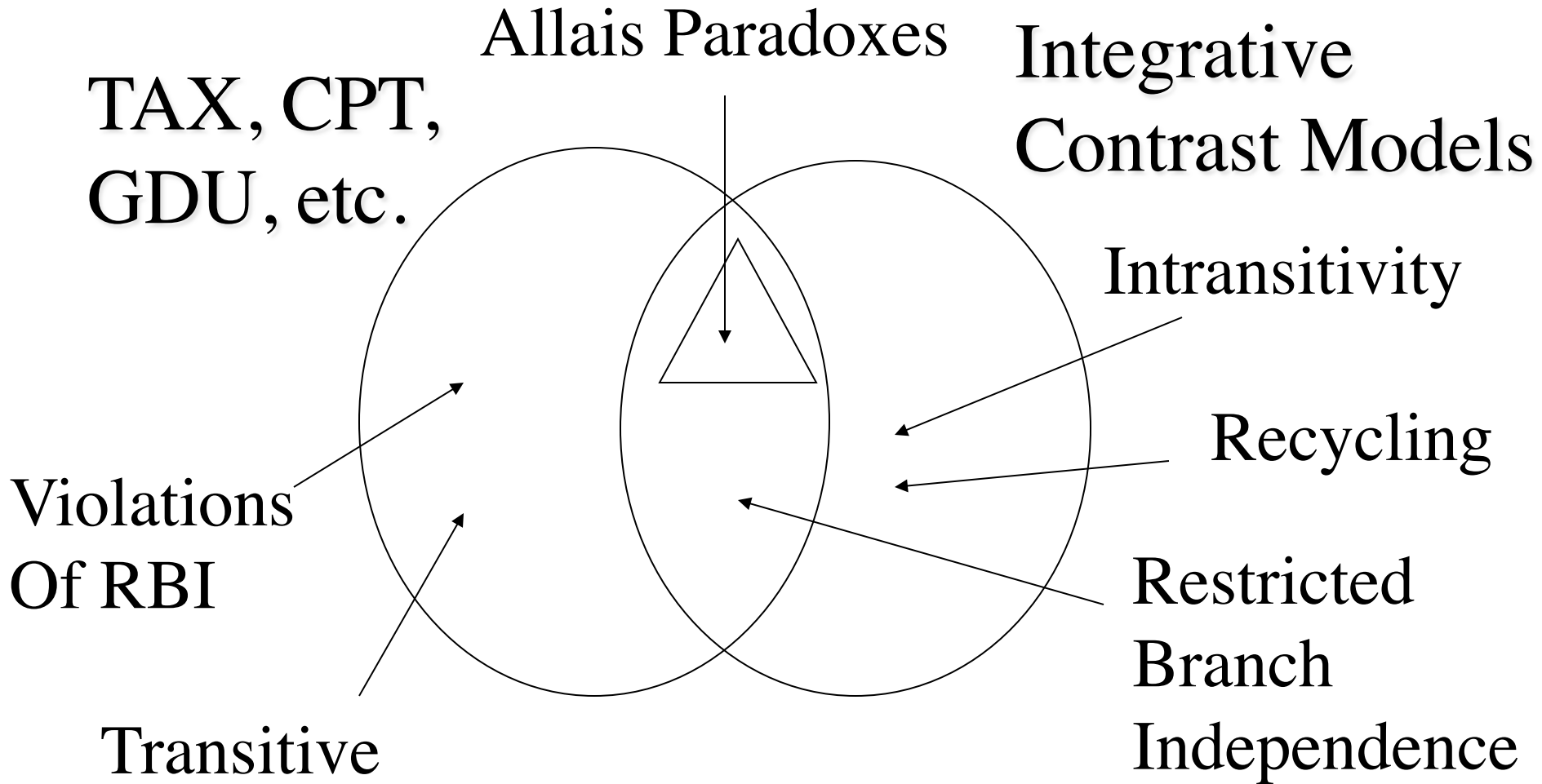
# Majority Rule Prediction

- $A = (\$4, \$5, \$6)$
- $B = (\$5, \$7, \$3)$
- $C = (\$9, \$1, \$5)$
- $AB$ : choose  $B$
- $BC$ : choose  $C$
- $CA$ : choose  $A$
- Notation: 222
- $A' = (\$6, \$4, \$5)$
- $B' = (\$5, \$7, \$3)$
- $C' = (\$1, \$5, \$9)$
- $A' B'$ : choose  $A'$
- $B' C'$ : choose  $B'$
- $C' A'$ : choose  $C'$
- Notation: 111

# Regret Prediction

- $A = (\$4, \$5, \$6)$
- $B = (\$5, \$7, \$3)$
- $C = (\$9, \$1, \$5)$
- $AB$ : choose  $A$
- $BC$ : choose  $B$
- $CA$ : choose  $C$
- Notation: 111
- $A' = (\$6, \$4, \$5)$
- $B' = (\$5, \$7, \$3)$
- $C' = (\$1, \$5, \$9)$
- $A' B'$ : choose  $B'$
- $B' C'$ : choose  $C'$
- $C' A'$ : choose  $A'$
- Notation: 222

# Non-Nested Models



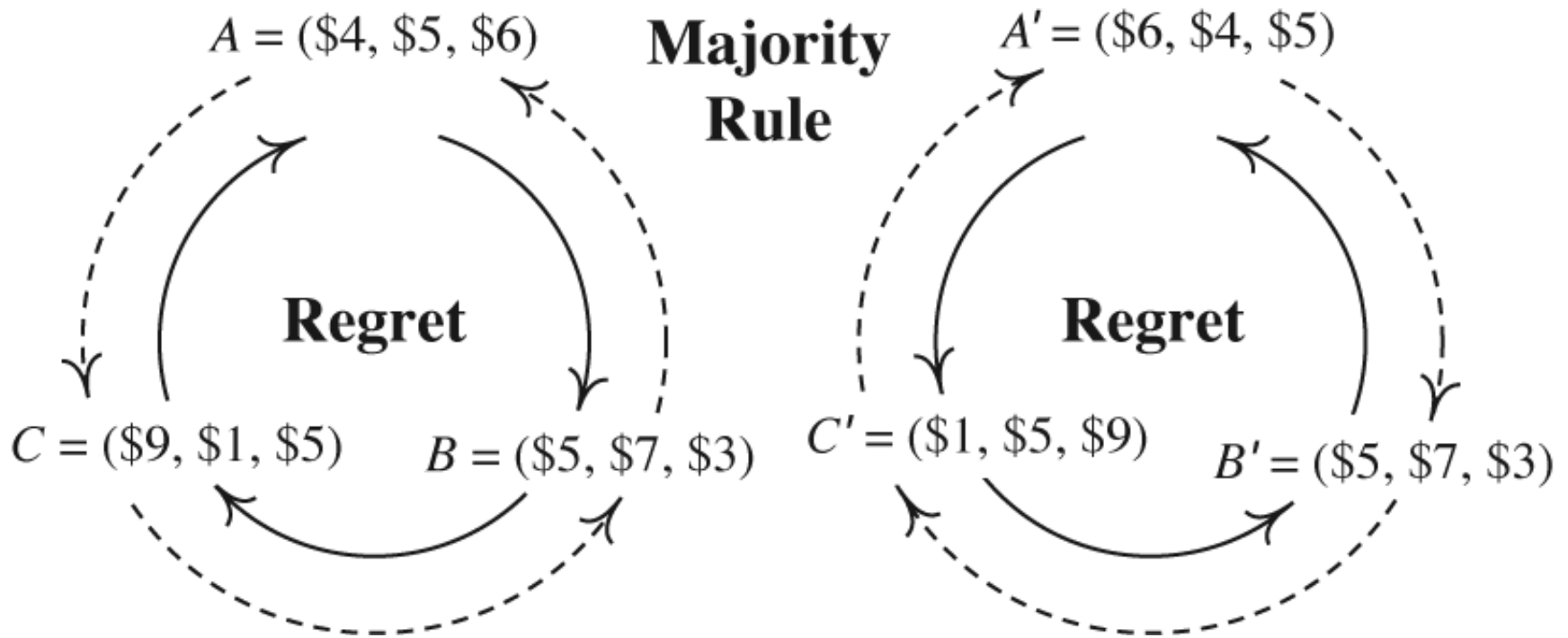
# Study

- 240 Undergraduates
- Tested via computers (browser)
- Clicked button to choose
- 30 choices (includes counterbalanced choices)
- 10 min. task, 30 choices repeated.

6. Which do you choose?

Choose	Color of Marble Drawn		
	Red	White	Blue
<input type="radio"/> First gamble	\$100	\$500	\$900
<input type="radio"/> Second gamble	\$500	\$700	\$300

# Recycling Predictions of Regret and Majority Rule



# Results

- Most people are transitive.
- Most common pattern is 112, pattern predicted by TAX with prior parameters.
- However, 2 people were perfectly consistent with MR on 24 choices (incl. Recycling pattern).
- No one fit Regret theory perfectly.



# Results: Continued

- Among those few (est. ~10%) who cycle (intransitive), most have no regrets (i.e., they appear to satisfy MR).
- Systematic Violations of RBI.
- Suppose 5-10% of participants are intransitive. Do we think that they indeed use a different process? Can we increase the rate of intransitivity?

# Conclusions

- Violations of transitivity predicted by regret, MR, LS appear to be infrequent.
- Violations of Integrative independence, priority dominance, interactive independence are frequent, contrary to family of LS, including the PH.
- “New paradoxes” rule out CPT and EU but are consistent with TAX.
- CPT, TAX, and EU are transitive and could have been refuted by systematic intransitivity, but data did not require rejection for most people.

# Editing: Another way to become intransitive

- Original Prospect Theory— (KT 79). Maybe people edit some choices but not others.
- B, P, & L (1999). Perhaps people would “see” stochastic dominance in simple choices and not in more complex ones.
- This theory properly tested in JDM (2016).

# Transitivity Analysis: R- scripts for Monte Carlo and Bootstrapping in TE models.

- Birnbaum, M. H., Navarro-Martinez, D., Ungemach, C., Stewart, N. & Quispe-Torreblanca, E. G. (2016). Risky decision making: Testing for violations of transitivity predicted by an editing mechanism. *Judgment and Decision Making*, 11, 75-91.
- <http://journal.sjdm.org/vol11.1.html>

# Results

- Results did not provide much evidence (if any) for intransitivity predicted by editing.
- People violated stochastic dominance too often even in the “easy” choices we thought would be “transparent” or at least “translucent”
- Paper shows proper methods for analysis of transitivity/intransitivity.