

A Systematic Test of the Independence Axiom

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Introduction

- How does one evaluate: $\frac{1}{3}$ chance of \$20, $\frac{1}{3}$ chance of \$30 and $\frac{1}{3}$ chance of \$10

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- Proposal: $\frac{1}{3}\$30 + \frac{1}{3}\$20 + \frac{1}{3}\$10$
- von Neumann Morgenstern: $\frac{1}{3}u(30) + \frac{1}{3}u(20) + \frac{1}{3}u(10)$

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- Proposal: $\frac{1}{3}\$30 + \frac{1}{3}\$20 + \frac{1}{3}\$10$
- von Neumann Morgenstern: $\frac{1}{3}u(30) + \frac{1}{3}u(20) + \frac{1}{3}u(10)$
 - ▶ Expected Utility Theory
- Used everywhere: Game theory, applied economics
- Advantage: Based on **observables**

Independence Axiom

- p, q, r : Lottery over $\{30, 20, 10\}$
- $\lambda \in [0, 1]$

$$\begin{array}{ccc} p & \succeq & q \\ & \& & \\ \lambda p + (1 - \lambda)r & \succeq & q + (1 - \lambda)r \end{array}$$

Independence Axiom

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$$\begin{array}{c}
 p \\
 \succeq \\
 \& \\
 \lambda p + (1 - \lambda)r
 \end{array}
 \succeq
 \begin{array}{c}
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 + (1 - \lambda)r
 \end{array}
 \quad \text{or} \quad
 \begin{array}{c}
 p \\
 \succeq \\
 \& \\
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 \end{array}
 \succeq
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 q \\
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 \end{array}$$

Table: Independence Axiom

Independence Axiom

$$\frac{\begin{array}{c} p \\ \succ \\ \& \\ \succeq \end{array} \quad q}{\lambda p + (1 - \lambda)r \quad \succeq \quad q + (1 - \lambda)r} \quad \text{or} \quad \frac{\begin{array}{c} p \\ \succ \\ \& \\ \prec \end{array} \quad q}{\lambda p + (1 - \lambda)r \quad \prec \quad \lambda q + (1 - \lambda)r}$$

Table: Independence Axiom

- If a DM declares p better than q
- Mixing p and q with same lottery r and in same proportion (λ) should not matter.

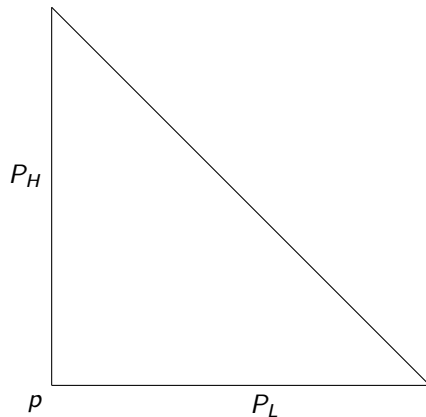
Allais Paradox

- Payoffs: $X = \{4000, 3000, 0\}$
- Lottery l : $(x_1, pr(x_1); x_2, pr(x_2); x_3, pr(x_3))$.
- $p = (4000, 0; 3000, 1; 0, 0)$
- $q = (4000, 0.80; 3000, 0; 0, 0.2)$.
- Mixing Lottery: $r = (4000, 0; 3000, 0; 0, 1)$
- Mixing Probability: $\lambda = \frac{1}{4}$

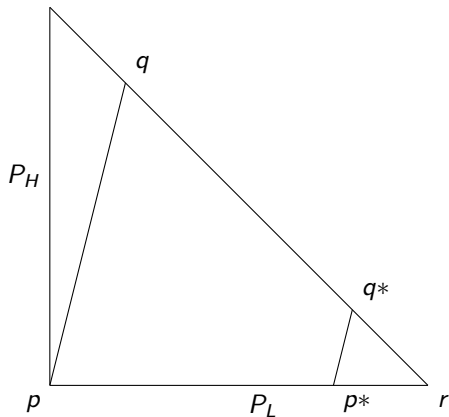
$$\begin{array}{ccc} p & \succ & q \\ & \& & \\ \frac{1}{4}p + (1 - \frac{1}{4})r & \prec & \frac{1}{4}q + (1 - \frac{1}{4})r \end{array}$$

Table: Allais paradox

Machina-Marshak Triangle



Allais in MM Δ



Certainty Effect

*“Consequently, I viewed the principle of independence as incompatible with the **preference for security in the neighborhood of certainty** shown by every subject... This led me to devise some counter-examples. One of them, formulated in 1952, has become famous as the ‘Allais Paradox.’ Today, it is as widespread as its real meaning is generally misunderstood.” - Maurice Allais (emphasis added)*

- p is better than q : p is certain
- q^* is better than p^* : p is no longer certain
- p loses its certainty appeal

Allais Paradox

- Allais's original intuition was that Independence will be violated "in the neighborhood of certainty," favoring certainty, but **not** otherwise
- Extensive experimental literature:
 - ▶ Confirm Allais Paradox: Camerer(1992), Starmer (1992)
 - ▶ Suggests otherwise: (Blavatsky 2010,2013)
- Extensive theory literature: Accommodates certainty effect
 - ▶ Dillenberger (2010)
 - ▶ Starmer (2003)
- Within "Allais Paradigm"

Allais Paradox: Features

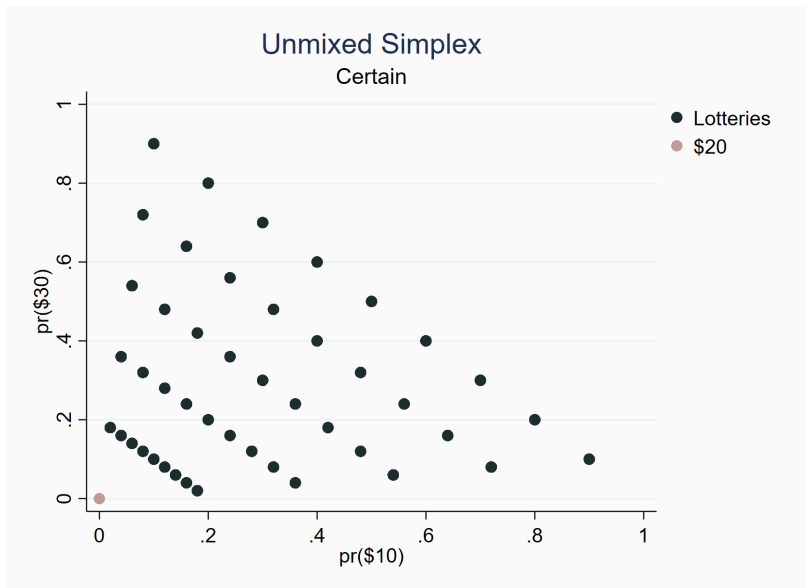
- p : certain
- r : bottom right corner
- High Payoffs

In This Paper...

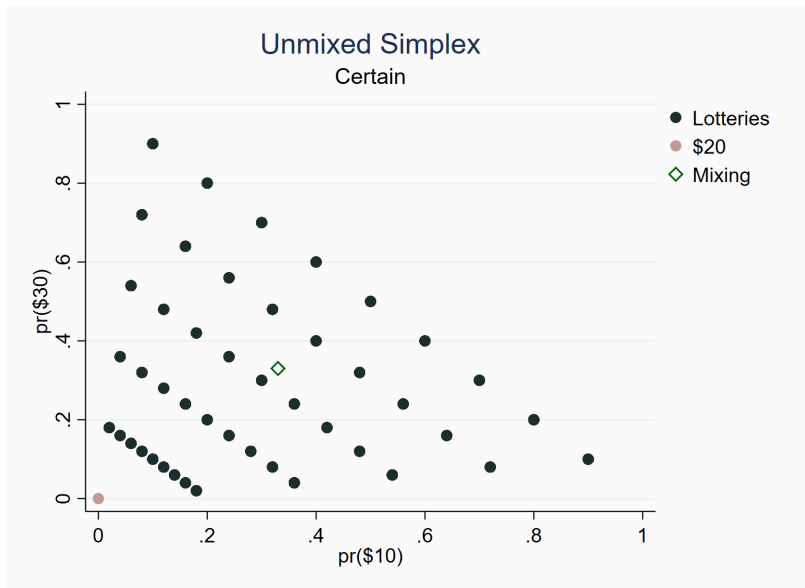
- Test Independence outside of “Allais Paradigm”
- Test Independence over the entire simplex
- Some decisions involve certainty, some don't
- Look to see where in the simplex Independence is violated most often
 - ▶ Whether these involve certainty or not
 - ▶ Can we explain most violations with a preference for certainty?
- Evaluate existing theories
- Empirical regularities for new theories

Design

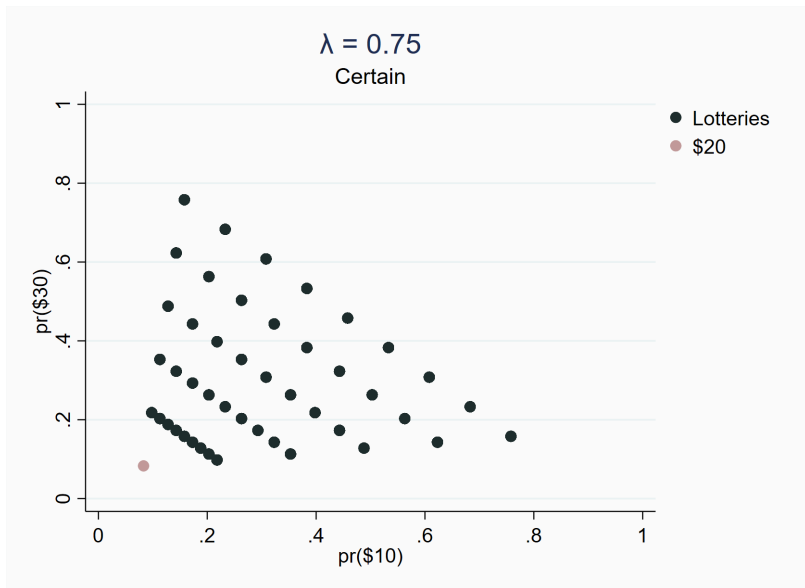
Questions



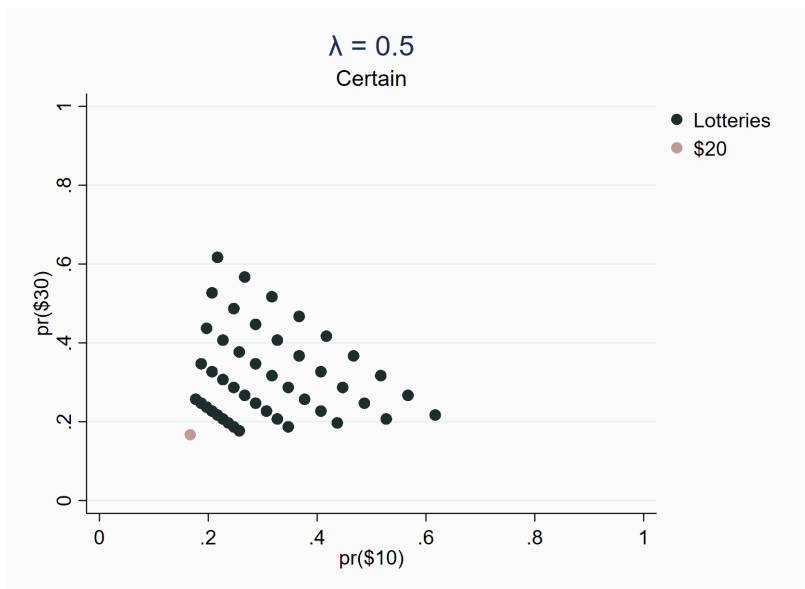
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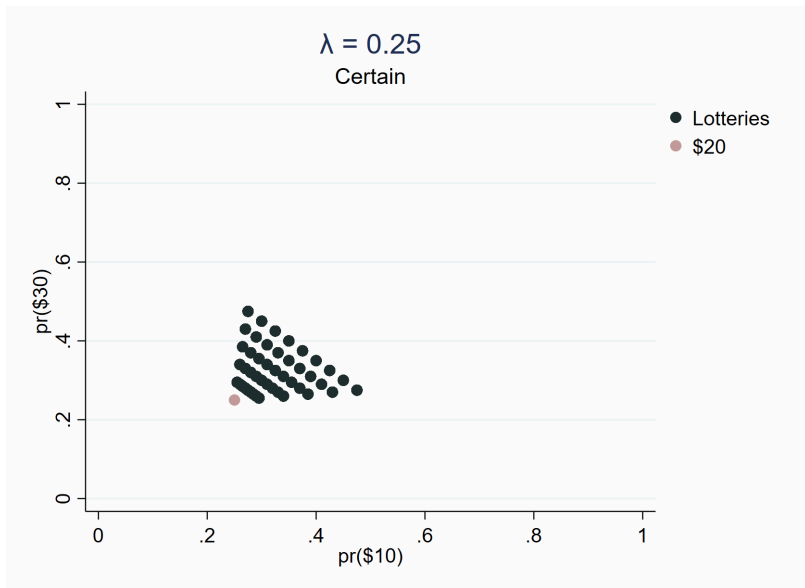
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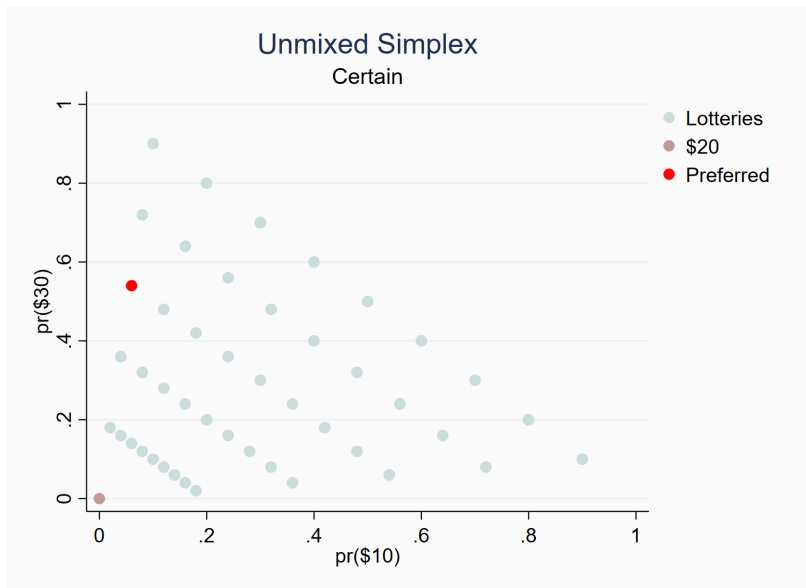
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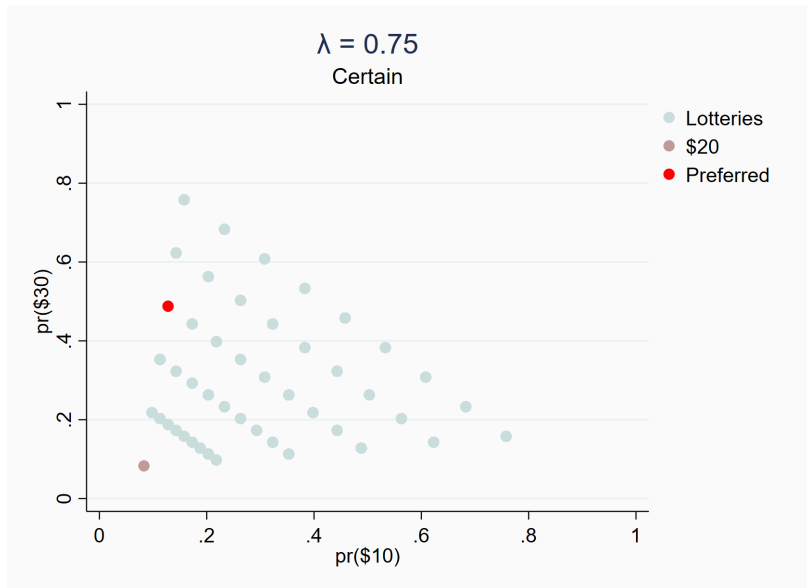
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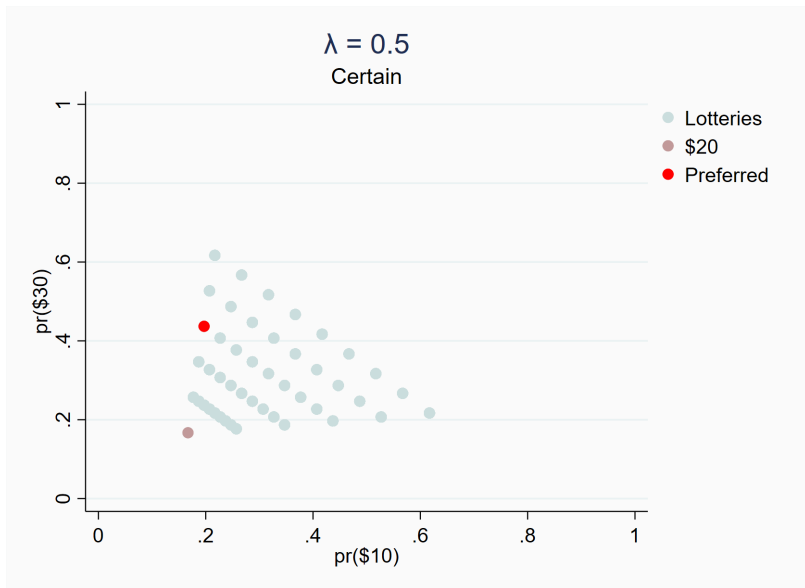
Independence Restriction



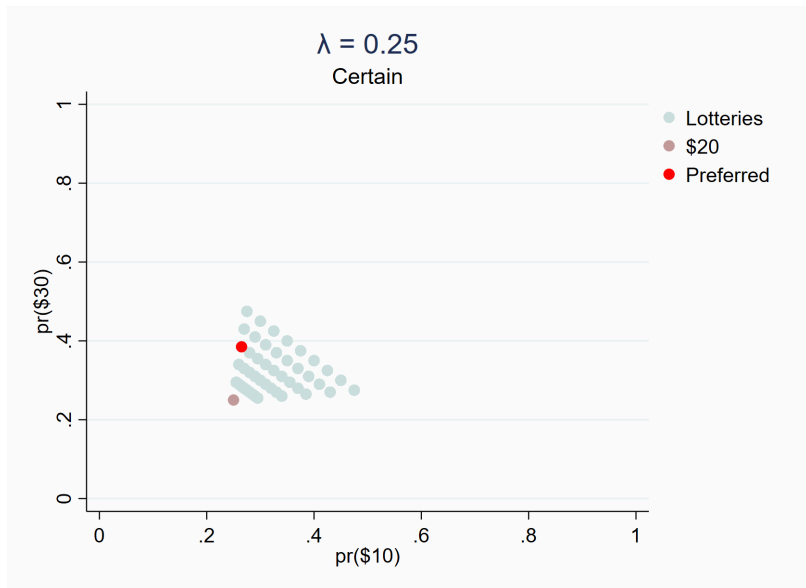
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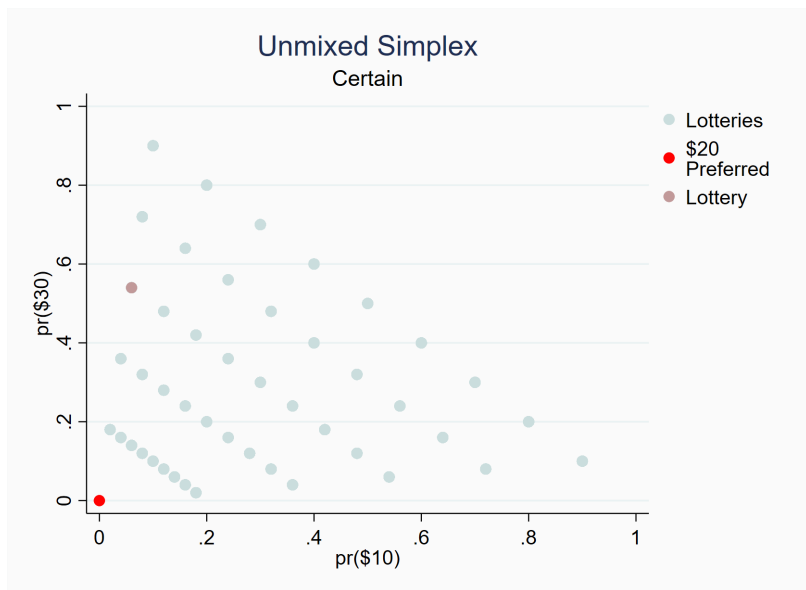
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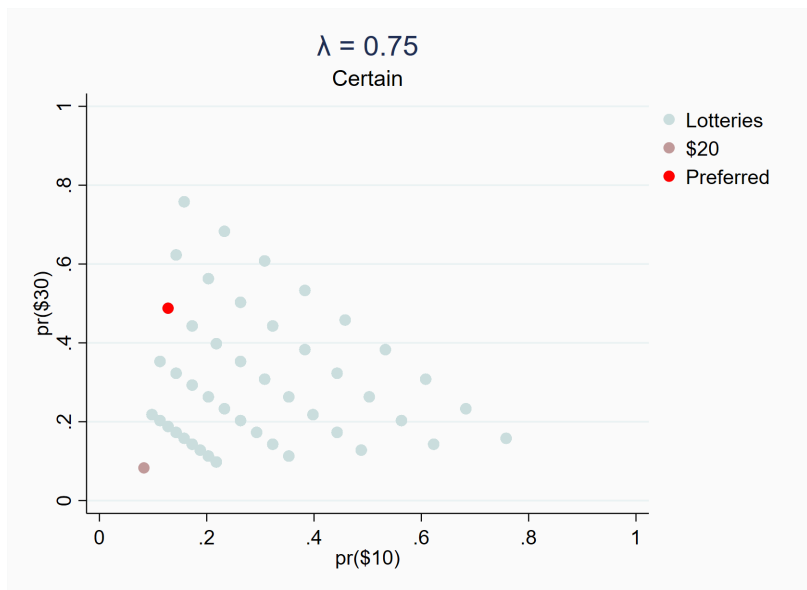
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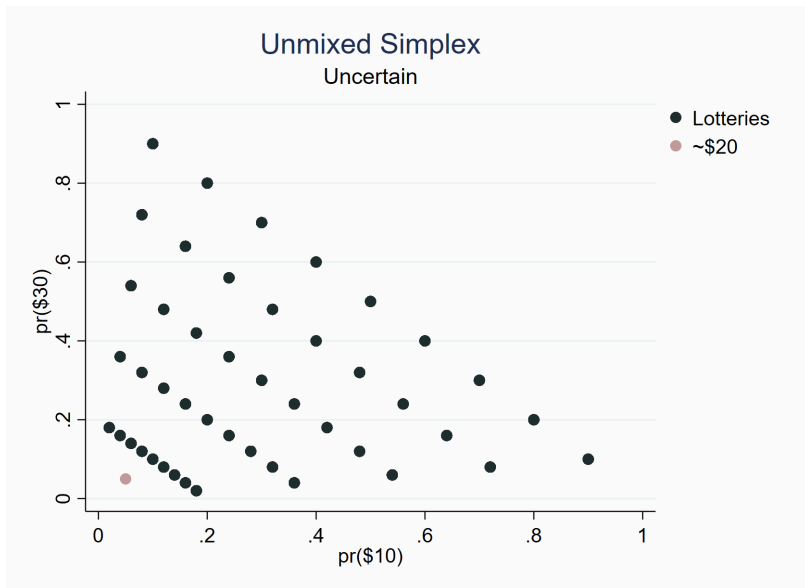
Allais Violation



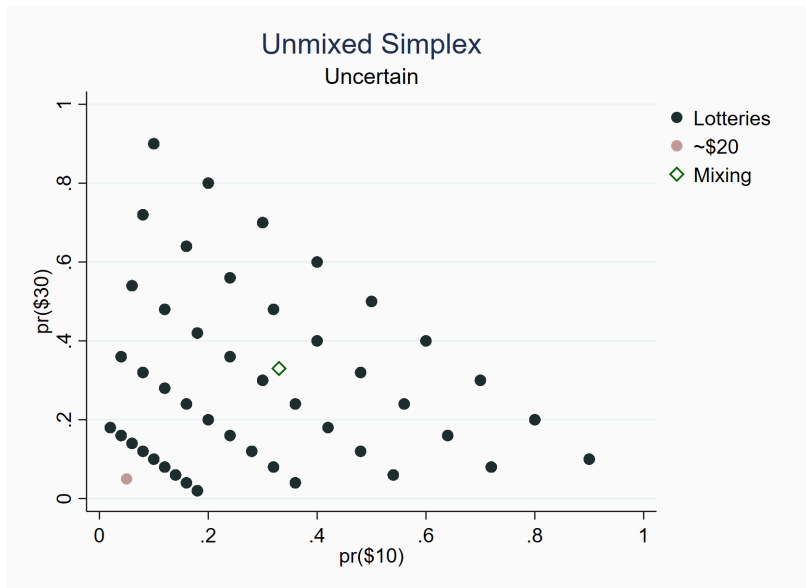
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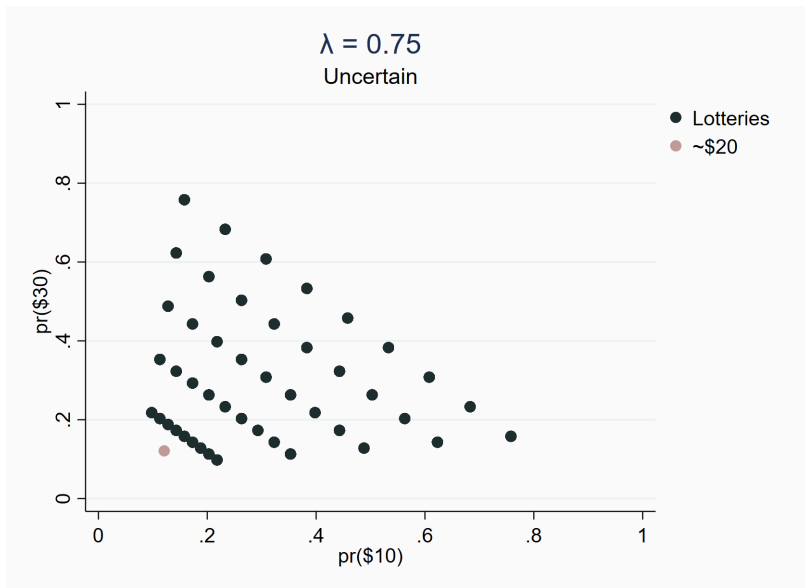
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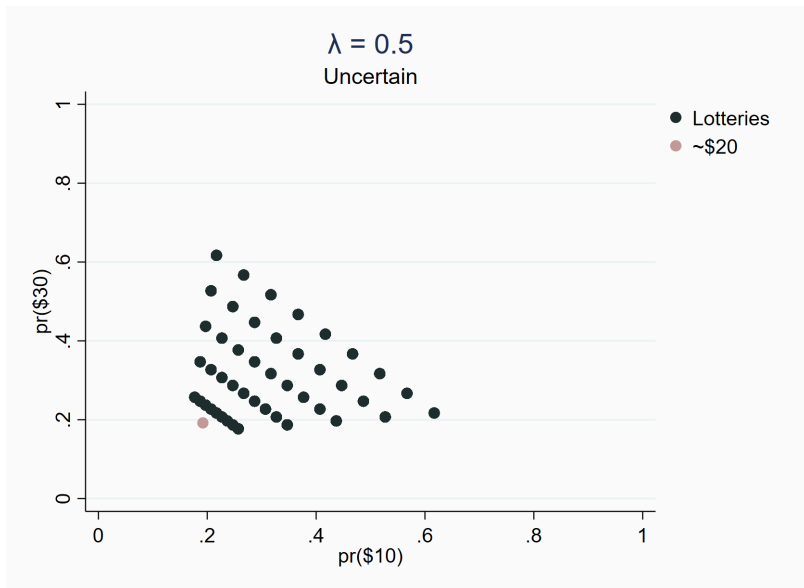
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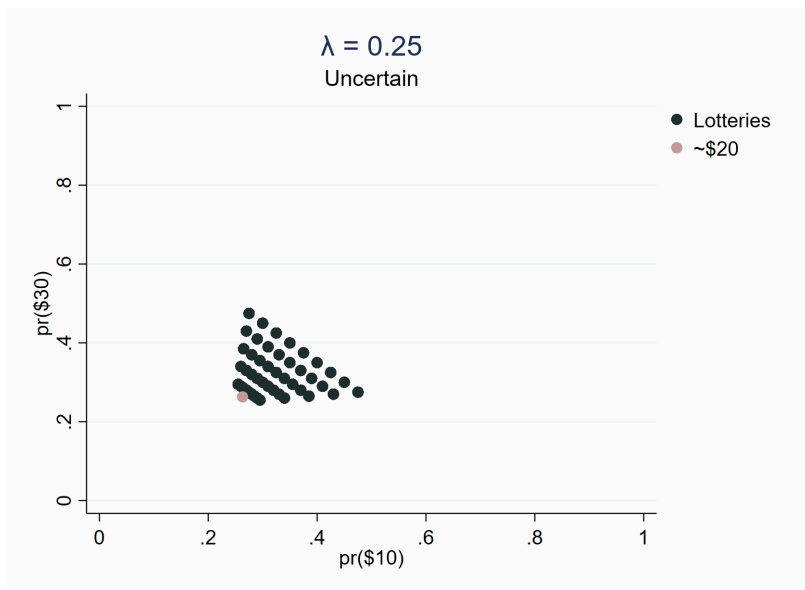
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Questions



Design

- 360 total questions
 - ▶ (45 questions per simplex) \times (8 simplices)
- Each subject saw 68 random questions
 - ▶ 17 unique $\lambda = 1$ comparison questions
 - ▶ Answered $\lambda = \{1, 0.75, 0.5, 0.25\}$ for each
 - ▶ 51 tests of independence per subject
 - ▶ Randomized independently for certainty and uncertainty
- 147 Subjects
- Average payment: \$20/30 min session
 - ▶ “High” stakes

ID: 3

Round 5 of 68



\$30: 24.00%

\$20: 40.00%

\$10: 36.00%



\$30: 0.00%

\$20: 100.00%

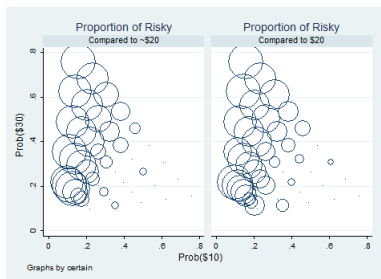
\$10: 0.00%

Results

Risk Preference Consistency

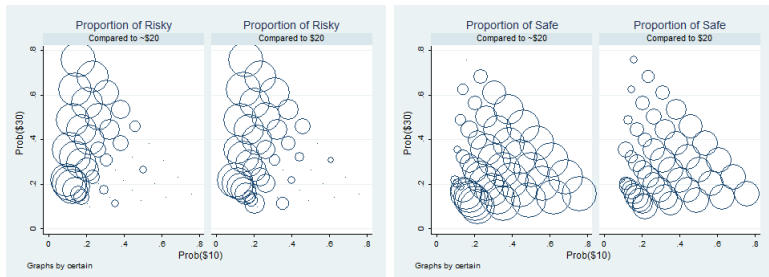
Proportion of Risky v/s Safe Choices

$$\lambda = .75$$



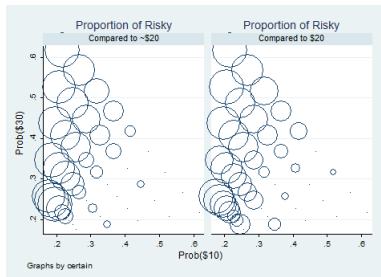
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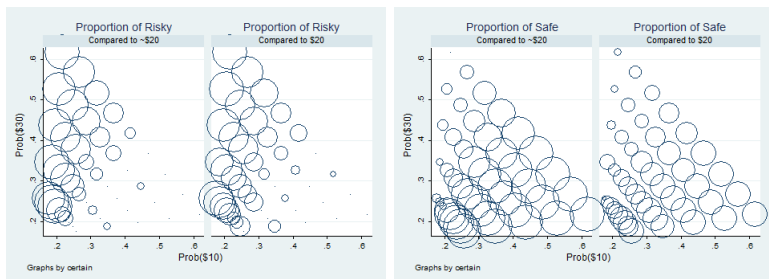
Proportion of Risky v/s Safe Choices

$\lambda = .50$



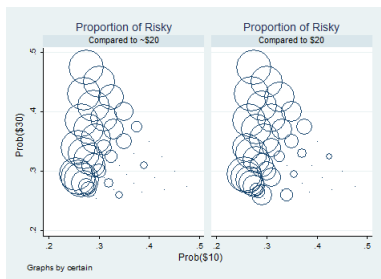
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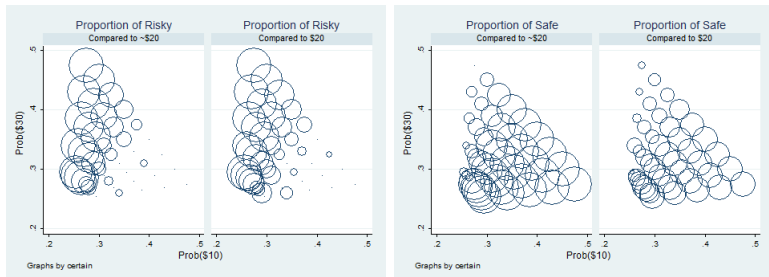
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Average Independence Violations

Average Independence Violations

- One pair: λ , certain and p
- Every λ , certain, p :

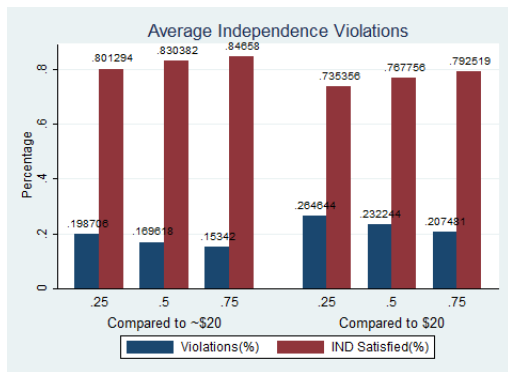
$$Violation(\lambda, \text{certain}, p) = \frac{RS + SR}{SS + SR + RS + SS}$$

- Every λ , certain and p :

$$NoViolation(\lambda, \text{certain}, p) = \frac{RR + SS}{SS + SR + RS + SS}$$

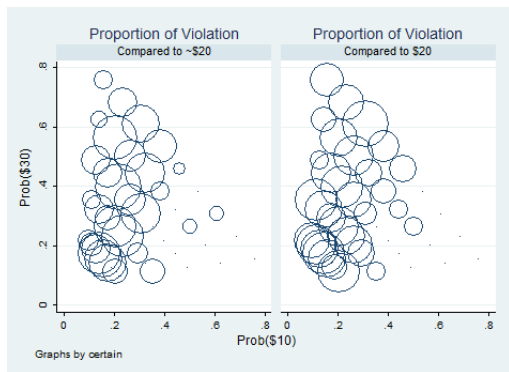
- Average over every pair: λ , certain and p

Aggregate Independence Violations

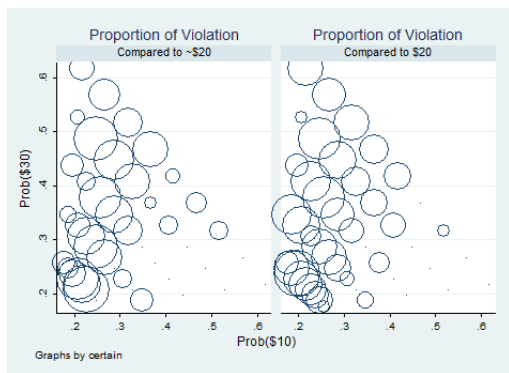


Where are Independence Violations?

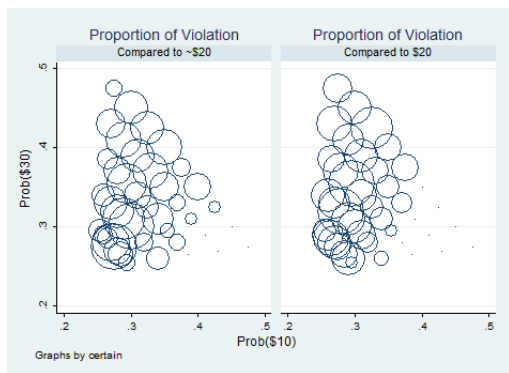
Independence Violations: $\lambda = .75$



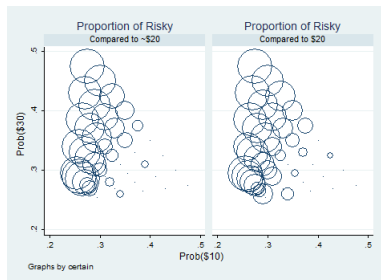
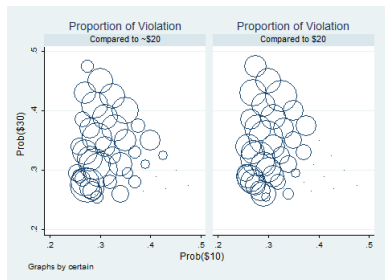
Independence Violations: $\lambda = .50$



Independence Violations: $\lambda = .25$



Independence Violations vs Risky: $\lambda = .25$



Pattern of Violations

- Violations correlated with “Risky” region
- Pattern I: $\text{Prob}(\text{Violation if Risky}) > \text{Prob}(\text{Violation if Safe})$
- Pattern II: $\text{Prob}(\text{Risky if Violation}) > \text{Prob}(\text{Safe if Violation})$

Violations: Pattern I

- One pair: λ , certain and p
- Every λ , certain, p :

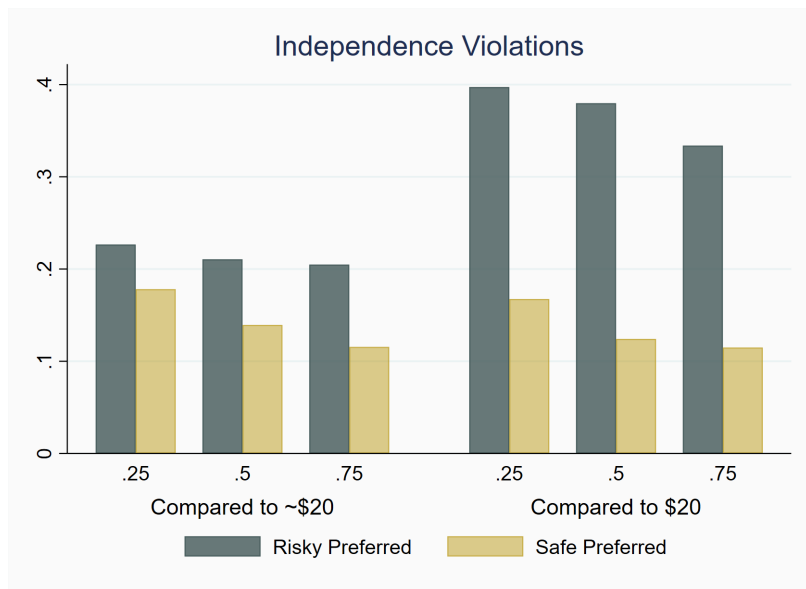
$$SafeViolation(\lambda, \text{certain}, p) = \frac{SR}{SR + SS}$$

- Every λ , certain and p :

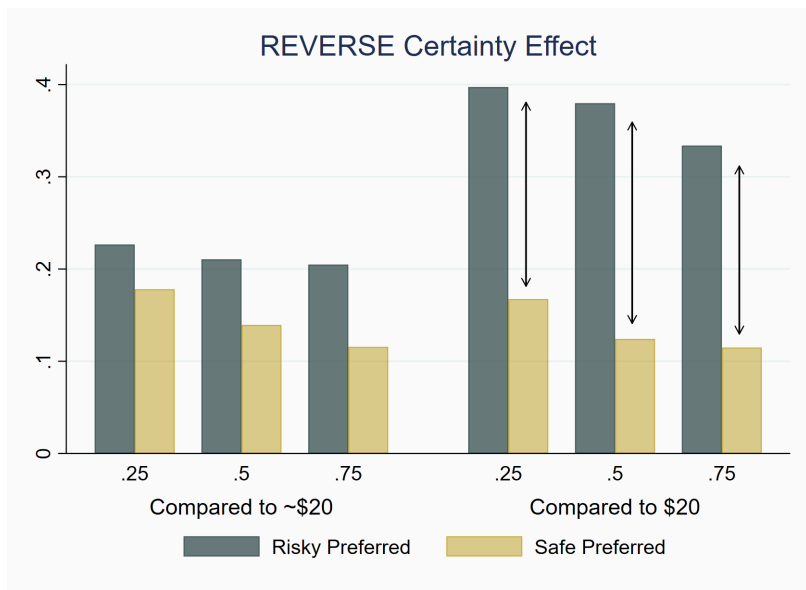
$$RiskyViolation(\lambda, \text{certain}, p) = \frac{RS}{RR + RS}$$

- Average over every pair: λ , certain and p

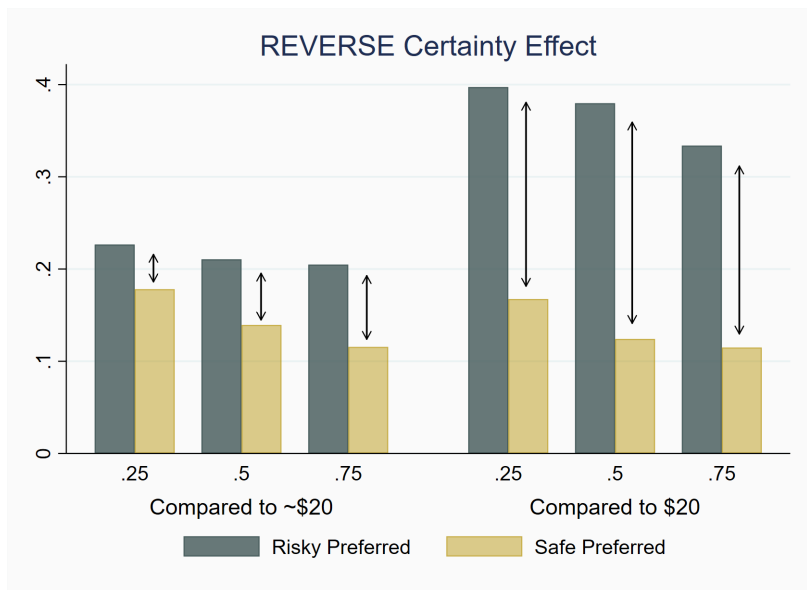
Independence Violations



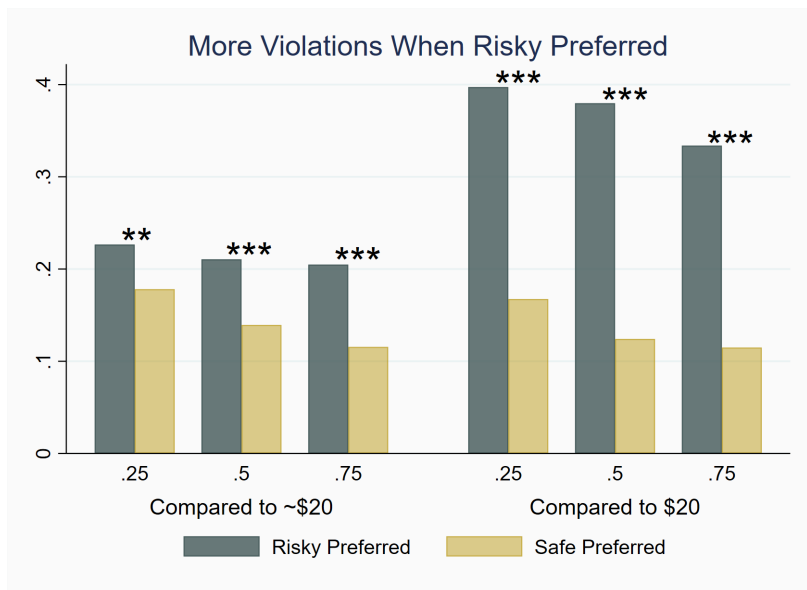
Independence Violations



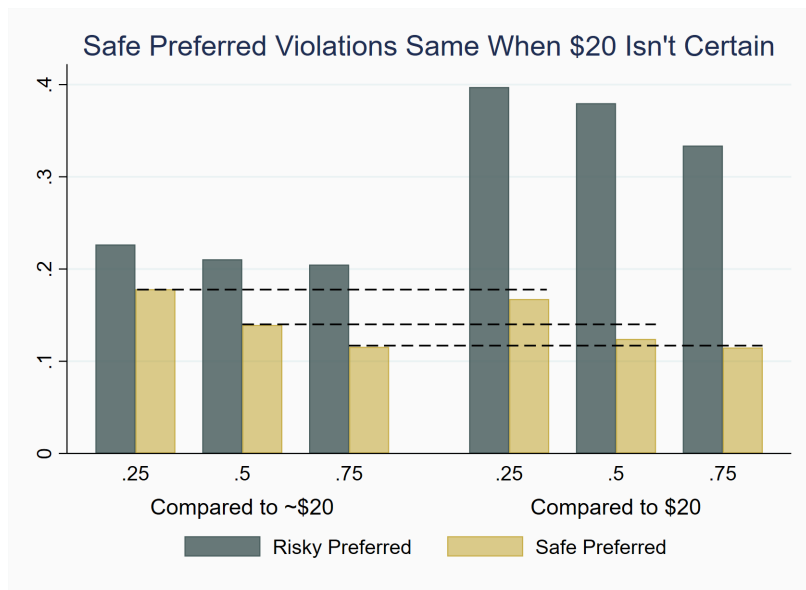
Independence Violations



Independence Violations



Independence Violations



Violations: Pattern II

- One pair: λ , certain and p
- Every λ , certain, p :

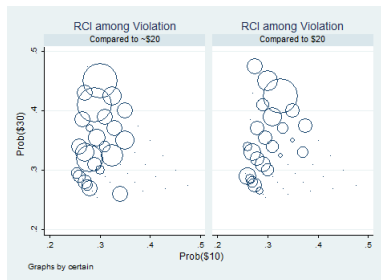
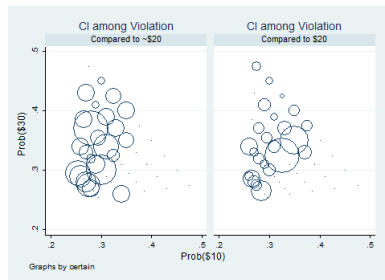
$$\text{SafeViolation}(\lambda, \text{certain}, p) = \frac{SR}{SR + RS}$$

- Every λ , certain and p :

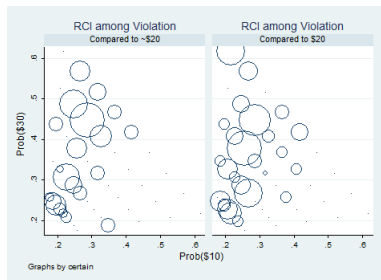
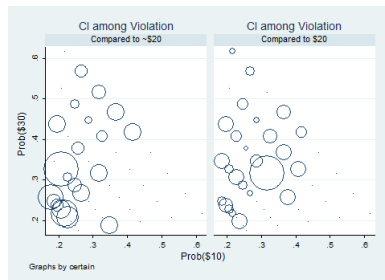
$$\text{RiskyViolation}(\lambda, \text{certain}, p) = \frac{RS}{SR + RS}$$

- Average over every pair: λ , certain and p

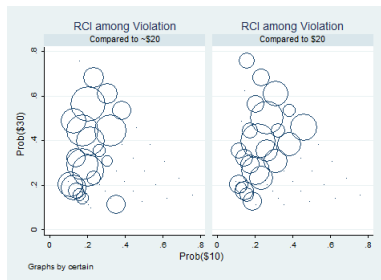
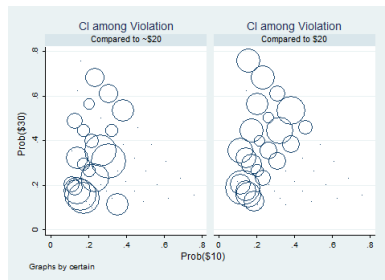
Pattern II Violations: $\lambda = .25$



Pattern II Violations: $\lambda = .50$



Pattern II Violations: $\lambda = .75$



Summary

- We conduct a large-scale test of the independence axiom
- Allow for general violations
- We find the exact opposite of the conventional wisdom
 - ① Reverse certainty effect
 - ② More violations when the risky lottery is preferred originally
 - ③ Just as many violations “near” certainty as at certainty itself
- A large literature has studied Allais-type violations
 - ▶ In our data, we should be more concerned about the opposite

Future Work

- Collect more data when r is at the bottom right, bottom left and top.

Thank You

