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# Probability Weighting in Recursive Evaluation of Two-Stage Prospects

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July 22, 2014

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# Outline

1/ Introductory remarks

2/ Conceptual framework

3/ Experimental study

4/ Concluding remarks

# Why investigating the evaluation of Two-stage prospects?

# Two-stage prospect and reduction of compound lotteries

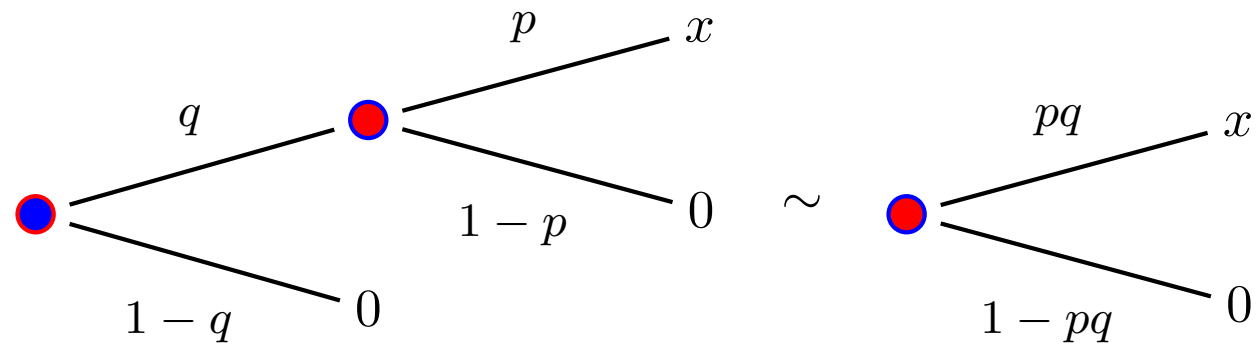


Table 1: compound risk and its reduced one-stage lottery

- Rational Decision makers (DMs) reduce compound risks, represented by compound lotteries, into single stage lotteries by using the Reduction of compound prospects axiom (RCP).

⇒ Rational DMs should exhibit a perfect neutrality toward compound risk.

However...

# Three observations on compound risk

1. Reduction of compound prospects have been descriptively challenged in many empirical investigations:
  - Bar Hillel (1973), Bernasconi & Loomes (1992), Budescu & Fisher (2001), Abdellaoui, Klibanoff & Placido (2014), Nebout & Dubois (2014)...
2. Following Becker & Brownson (1964) and Yates and Zukowski (1976), Segal (1987, 1990) represented ambiguous bets as two-stage prospects.
3. Prospect Theory (PT) is the most successful descriptive model of decision making under risk and ambiguity.  
  
⇒ Would it still be the case when dealing with attitudes toward two-stage prospects?

# Theoretical and Empirical Background

# Background: One-stage prospects

- $(x, p; y)$  denotes the one-stage *prospect* resulting in outcome  $x$  with probability  $p$  and in outcome  $y$  with probability  $1 - p$  with  $x \geq y \geq 0$ .
  - Probability  $p$  is generated using a known urn containing 100 balls numbered from 1 to 100, i.e. drawing a ball which has a number between 1 and  $p \times 100$ .
  
- $(x, E_p; y)$  denotes the corresponding ambiguous prospect. The probability  $P(E_p)$  is unknown to the DM.
  - We use an unknown containing 100 balls numbered from 1 to 100 in unknown proportions, i.e. drawing a ball which has a number between 1 and  $p \times 100$ . Symmetry arguments imply  $P(E_p) = p$ . (Chew & Sagi, 2006, 2008)





# Background: Evaluation of one-stage prospects

- Under Expected Utility (EU), prospects are evaluated as follows:

$$EU(x, p; y) = pu(x) + (1 - p)u(y)$$

- Where  $u$  is the utility function (and a risk attitude index).
- Violations of EU popularized by Kahneman & Tversky.

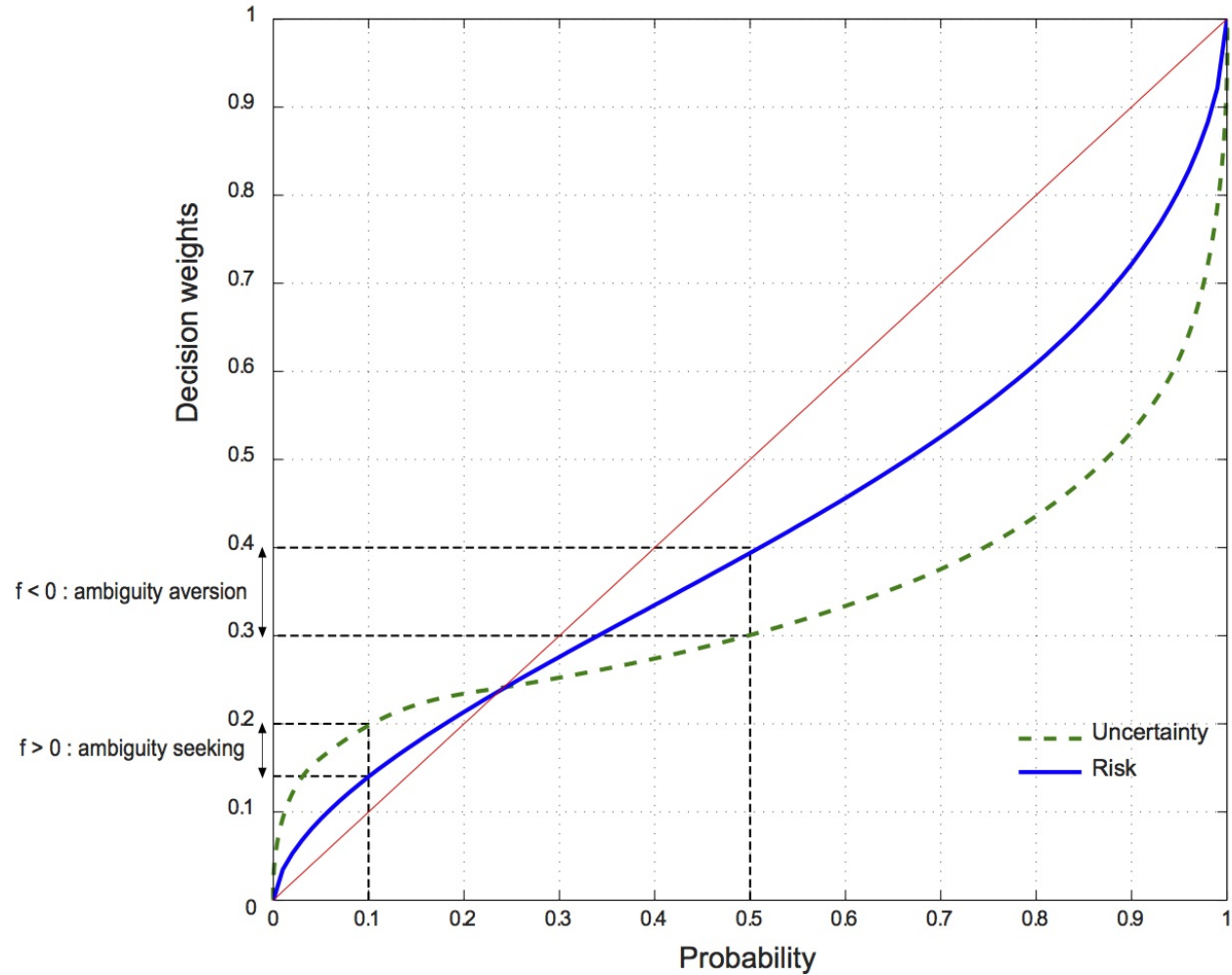
- Under Prospect Theory (PT), prospects are evaluated as follows in the gain domain:

$$PT(x, p; y) = w(p)u(x) + (1 - w(p))u(y)$$

- $u$  is the utility function.
- $w$  is the probability weighting function.  $w$  is strictly increasing and satisfies  $w(0) = 0$  and  $w(1) = 1$ .

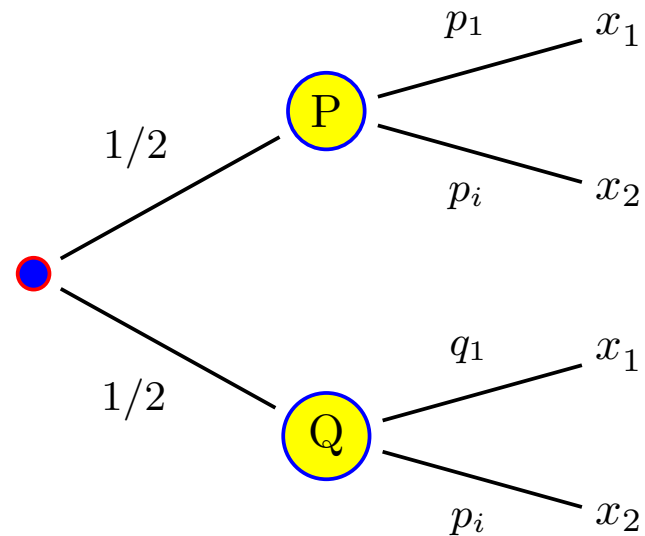
⇒ Many experimental evidence on RDU under risk and ambiguity.

# Probability weighting under risk and ambiguity



⇒ Ambiguity increases **likelihood insensitivity**.

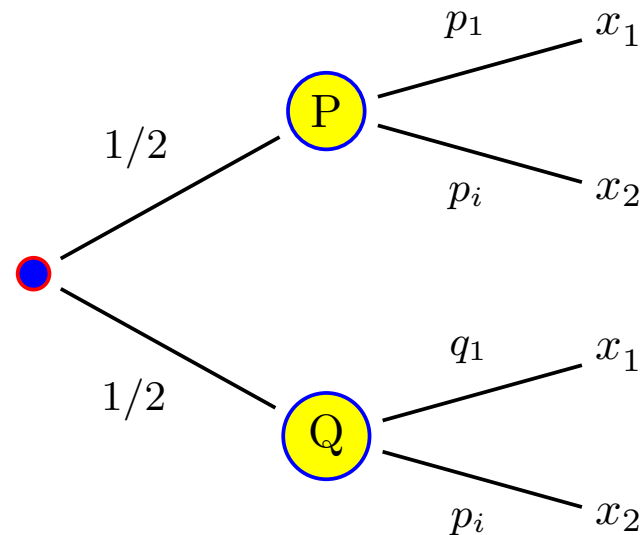
# How to evaluate two-stage prospects?



- Traditional Recursive Expected Utility (TREU):

$$\Rightarrow \frac{1}{2} \times EU(P) + \frac{1}{2} \times EU(Q)$$

# How to evaluate two-stage prospects?

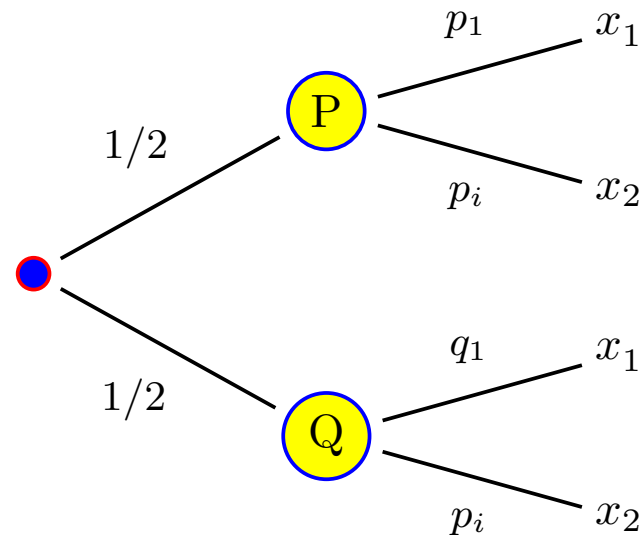


- Recursive Expected Utility without RCP (REU):

$$\Rightarrow \frac{1}{2} \times \phi [EU(P)] + \frac{1}{2} \times \phi [EU(Q)]$$

- Kreps & Porteus (1978) introduced this transformed EU functional to account for delayed resolution of uncertainty.
- Klibanof & al. (2005) used the same preference functional to model ambiguity. (Seo, 2009, Ergin & Gul (2008),...)

# How to evaluate two-stage prospects?



- Recursive Prospect Theory (RPT):

$$\Rightarrow \pi_1 \times \phi [PT(P)] + \pi_2 \times \phi [PT(Q)]$$

- Segal (1987) suggested this recursive form of RDU to model ambiguity attitudes through second-order probabilities.
- Abdellaoui & Zank (2014) provide the first axiomatization of this general form of Prospect Theory.

# Experimental Design

# Experiment: outline

62 subjects:

- Parts 1 & 2: certainty equivalents for known and unknown Ellsberg urns ( $2 \times 13$  equivalents).
- Parts 3 & 4: matching probabilities for two-stage prospects ( $2 \times 10$  equivalents).
- Payment: show up 10 euros + RIS (max 50 euros).
- Individual interviews (about 45 minutes).

Under RPT, we aim to elicit the following functionals:

	Elicitation 1: Risk	Elicitation 2: Ambiguity
Attitudes towards 1-stage prospects	$u$ $w$	$\tilde{u}$ $\tilde{w}$
Attitudes towards 2-stage prospects	$w^*$	$\tilde{w}^*$

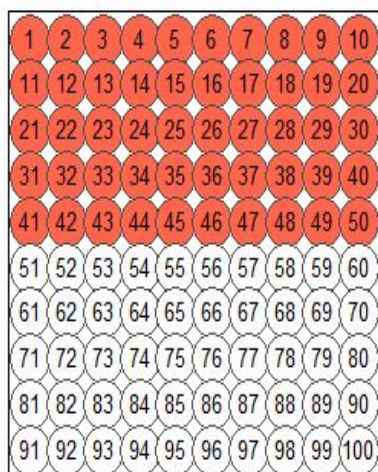


# Certainty equivalents for one-stage prospects

	$c \sim (x, p; y)$ and $\tilde{c} \sim (x, E_p; y)$						$c_p \sim (x, p; y)$ and $\tilde{c}_p \sim (x, E_p; y)$						
$x$	50	40	50	50	25	10	50	50	50	50	50	50	50
$y$	25	20	10	35	5	0	0	0	0	0	0	0	0
$p$	0.30	0.30	0.30	0.30	0.30	0.30	0.02	0.06	0.17	0.33	0.50	0.67	0.94
$E_p$	$E_{30}$	$E_{30}$	$E_{30}$	$E_{30}$	$E_{30}$	$E_{30}$	$E_2$	$E_6$	$E_{17}$	$E_{33}$	$E_{50}$	$E_{67}$	$E_{94}$

- Under risk, we elicit  $c$  and  $c_p$  following Abdellaoui & al. (2008).
  - Under ambiguity, we elicit  $\tilde{c}$  and  $\tilde{c}_p$  following Abdellaoui & al. (2011).
- ⇒ We can compare our results to these benchmark studies.

## Alternative A



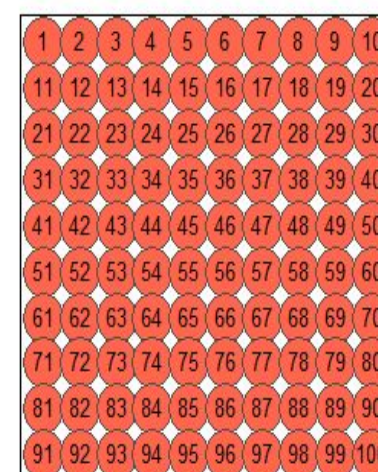
n° 1 à 50 vous gagnez : 50 €

sinon 0 €

## Exemples

- |                       |                                     |                       |      |
|-----------------------|-------------------------------------|-----------------------|------|
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 0 €  |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 5 €  |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 10 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 15 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 20 € |
| <input type="radio"/> | <input checked="" type="checkbox"/> | <input type="radio"/> | 25 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 30 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 35 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 40 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 45 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 50 € |

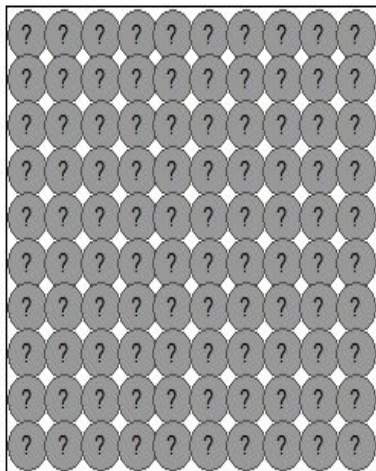
## Alternative B



n° 1 à 100 vous gagnez : 25 €

OK

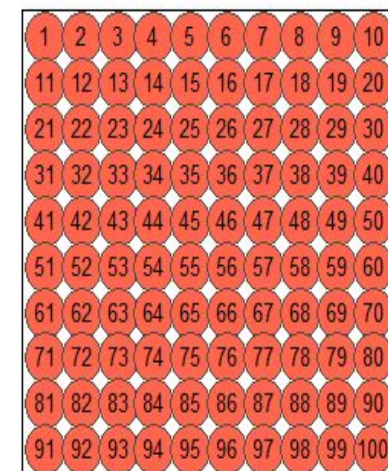
## Alternative A



n° 1 à 50 vous gagnez : 50 €

sinon 0 €

## Alternative B



n° 1 à 100 vous gagnez : 18 €

- |                       |                                     |                       |        |
|-----------------------|-------------------------------------|-----------------------|--------|
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 15 €   |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 15.5 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 16 €   |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 16.5 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 17 €   |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 17.5 € |
| <input type="radio"/> | <input checked="" type="checkbox"/> | <input type="radio"/> | 18 €   |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 18.5 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 19 €   |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 19.5 € |
| <input type="radio"/> | <input type="checkbox"/>            | <input type="radio"/> | 20 €   |

OK

# Matching probabilities for two-stage prospects

$$((\bar{x}, p), q) \sim (\bar{x}, r) \text{ and } ((\bar{x}, E_p), q) \sim (\bar{x}, \tilde{r})$$

$q$	1/3	1/3	1/3	1/3	1/3	2/3	2/3	2/3	2/3	2/3
$p$	0.06	0.17	0.33	0.50	0.94	0.06	0.17	0.50	0.75	0.94
$E_p$	$E_6$	$E_{17}$	$E_{33}$	$E_{50}$	$E_{94}$	$E_6$	$E_{17}$	$E_{50}$	$E_{75}$	$E_{94}$

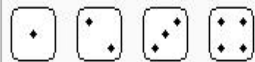
- $\bar{x} = 50$ .
- 10 matching probabilities for risky second stage stage,  $r$  and 10 for ambiguous second stage  $\tilde{r}$ .
- 2 first stage probability levels: 1/3 and 2/3.

⇒ Elicitation, comparison and test of 4 second stage probability weighting functions.

## Alternative A

(Deux tirages)

## Tirage Préliminaire



Rien n'est gagné



Vous tirez une boule dans l'urne



n° 1 à 30 vous gagnez : 50 €

sinon 0 €

## Exemples

- 0 boules
- 10 boules
- 20 boules
- 30 boules
- 40 boules
- 50 boules
- 60 boules
- 70 boules
- 80 boules
- 90 boules
- 100 boules

## Alternative B

(Un seul tirage)



n° 1 à 10 vous gagnez : 50 €

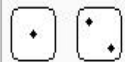
sinon 0 €

OK

## Alternative A

(Deux tirages)

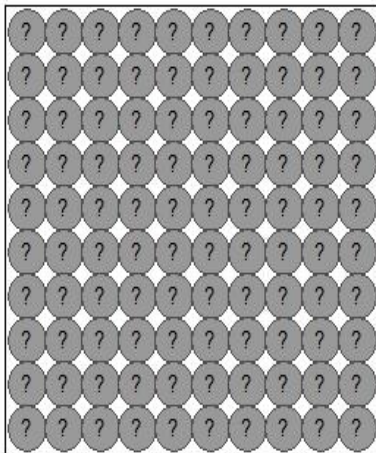
## Tirage Préliminaire



Rien n'est gagné



Vous tirez une boule dans l'urne



n° 1 à 50 vous gagnez : 50 €

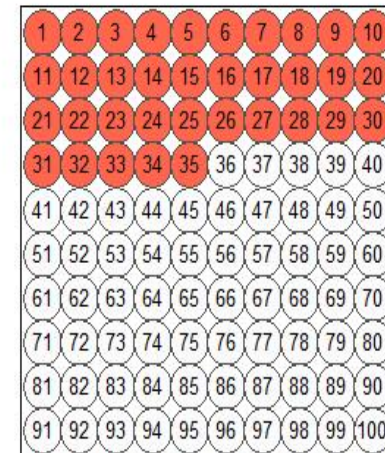
sinon 0 €

## Exemples

- 30 boules  
   31 boules  
   32 boules  
   33 boules  
   34 boules  
   35 boules  
   36 boules  
   37 boules  
   38 boules  
   39 boules  
   40 boules

## Alternative B

(Un seul tirage)



n° 1 à 35 vous gagnez : 50 €

sinon 0 €

OK

# Model Specification

# Model specification: TREU and REU

Using the equivalence revealed by the elicitation of the matching probability  $r$ :

$$((\bar{x}, p), q) \sim (\bar{x}, r)$$

we infer the following equalities:

1. Under TREU, we have:

$$q \times p = r$$

2. Under REU, we have:

$$q \times \phi(p) = \phi(r)$$

Where  $\phi$  is a transformation function.

**Parametric specification:**  $\phi(x) = x^{1/\theta}$ .



# Model specification RPT

- Under RPT, we have:

Setup	RPT- $r$ RPT for "risk-risk"	RPT- $a$ RPT for "risk-ambiguity"
One-stage	$c \sim (x, p; y)$ $u(c) = w(p)u(x) + (1 - w(p))u(y)$	$c \sim (x, p; y)$ $u(c) = w(p)u(x) + (1 - w(p))u(y)$
		$\tilde{c} \sim (x, E_p; y)$ $u(\tilde{c}) = \tilde{w}(p)u(x) + (1 - \tilde{w}(p))u(y)$
Two-stage	$((\bar{x}, p), q) \sim ((\bar{x}, m), 1)$ $w(q)w^*(p) = w^*(\tilde{m})$	$((\bar{x}, E_p), q) \sim ((\bar{x}, \tilde{m}), 1)$ $w(q)\tilde{w}^*(p) = w^*(\tilde{m})$

- Parametric specifications:

$$u(x) = x^\alpha \text{ and } w(p) = \exp(-(-\ln(p)^\gamma)^\delta).$$

# Results

## Results: RCP and TREU

$p$	$q = 1/3$		$q = 2/3$	
	$\#(\Delta \geq 0)$	$t$ -test	$\#(\Delta \geq 0)$	$t$ -test
0.06	60/2	8.42**	48/14	2.12**
0.17	38/24	3.65**	27/35	-0.22 <sup>ns</sup>
0.33	26/28	2.26*	-	-
0.50	39/23	3.39**	24/38	-1.96*
0.75	-	-	24/25	0.33 <sup>ns</sup>
0.94	27/35	0.69 <sup>ns</sup>	40/22	1.99**

Table 2: RCP ( $\Delta = (r - pq)/pq$ )

- RCP is globally violated, thus TREU is not descriptively valid for evaluating two-stage prospects.
- Overall, we observe preference for the compound prospect, especially for  $q = 1/3$ .

## Results: REU under risk

Here, we present the descriptive statistics of the 3 OLS estimations of  $\theta$ , assuming  $\phi(x) = x^{1/\theta}$  under risk (i.e. only using the matching probabilities,  $r$ )

	Probability $q$		
	1/3	2/3	{1/3, 2/3}
Mean	0.89	1.03	0.91
Median	0.90	0.98	0.91
Std	0.18	0.35	0.18
IQR	0.75-0.98	0.83-1.23	0.79-1.01

- At an aggregate level,  $\phi$  is convex for  $q = 1/3$  but exhibits linearity for  $q = 2/3$ .
  - Impact of probability  $q$  on the shape of function  $\phi$  is confirmed by a paired  $t$ -test ( $p < 0.01$ ).
- ⇒ Inconsistent with REU in which the probabilistic structure of the two-stage prospect should not impact the shape of  $\phi$ .

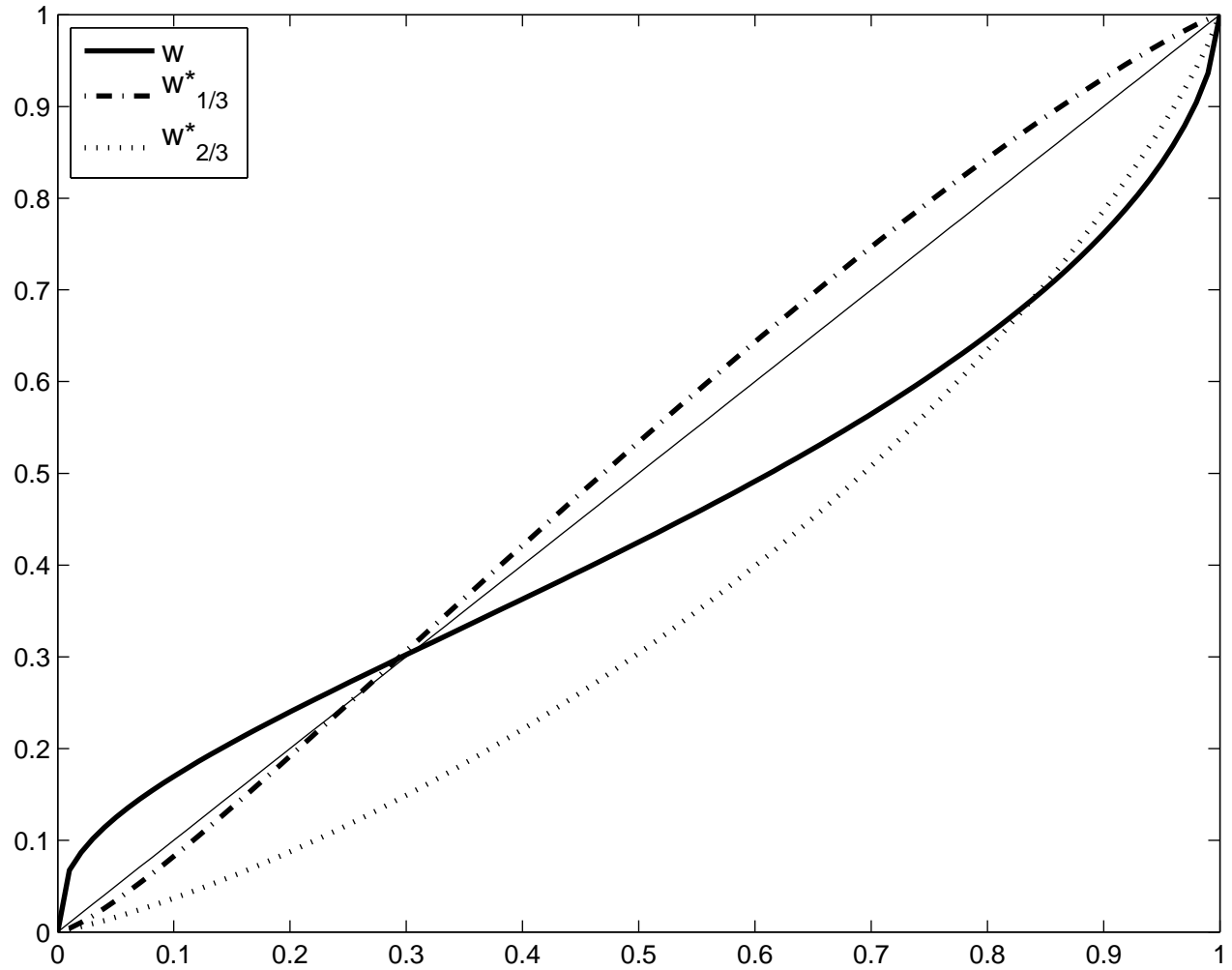
## Results: RPT under risk

Stage	func	param	Estimates			
			Mean	Median	Std	IQR
First	$u$	$\alpha$	0.94	0.93	0.26	0.74-1.10
		$\gamma$	1.06	1.07	0.32	0.85-1.22
	$w$	$\delta$	0.62	0.61	0.20	0.48-0.77
Second	$w_{1/3}^*$	$\gamma_{1/3}^*$	1.01	0.96	0.42	0.74-1.18
		$\delta_{1/3}^*$	1.20	1.15	0.29	1.03-1.35
	$w_{2/3}^*$	$\gamma_{2/3}^*$	1.66	1.63	0.52	1.25-2.04
		$\delta_{2/3}^*$	0.90	0.85	0.28	0.69-1.07

□ Function,  $w^*$ , depends on probability  $q$ . While it is close to linearity for  $q = 1/3$ , it is convex for  $q = 2/3$ .

⇒ Inverse than for REU but same problem (differences both for elevation and curvature between  $w_{1/3}^*$  and  $w_{2/3}^*$ ).

# Results: RPT under risk



# Additional results

- Adding ambiguity (first and second stage) does not change our main results i.e.
  - Impact of probability  $q$  on the shape of function  $\phi$ .
  - Stage dependent pwf.
  - Dependence of the second stage pwf on the first stage probability.
- Benchmark results are found for the single stage pwf under risk and ambiguity.
- No association between RCP and ambiguity attitudes ( $\neq$  from Halevy, 2008 and Segal).

# Concluding remarks

1. Recursive evaluation of two-stage prospects is more complex than allowed by any existing recursive model.
2. In Kreps and Porteus (or KMM) integral, function  $\phi$  is sensitive to the first-stage probability of winning.
3. Second-stage probability weighting is very sensitive to the first-stage winning probability.

⇒ Abdellaoui & Zank (2014) first axiomatized a RPT model that could account for our experimental findings.



Thank you for your attention!