

# Demand for Insurance: Which Theory Fits Best?

Some VERY preliminary experimental results from Peru

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# Goals Today

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- Theory
  - ▣ Consider a specific empirical context (Pisco, Peru);
  - ▣ Develop two alternative contracts: A) Linear, B) Lump Sum;
  - ▣ Compare predictions of insurance demand under:
    - Expected Utility Theory;
    - Cumulative Prospect Theory.
  - ▣ Highlight preference parameter spaces such that theories generate different demand predictions.
  - ▣ Preference parameters: Risk aversion, Probability weighting, Loss aversion.
  
- Empirical Approach
  - ▣ Experimental insurance games with Pisco cotton farmers
  - ▣ Part I: Elicit farmer-specific values of preference parameters
  - ▣ Part II: Elicit farmers' choice across contracts (Linear vs. Lump Sum vs. None)
  
- Descriptive evaluation of theories: Which theory seems to be most consistent with elicited parameters?

# Linear vs. Lump Sum Contracts

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## Income under **No Insurance**:

- $Y^N = Apq$
- A: Area (ha); p: Output price (\$/qq); q: yield (qq/ha)

## Compare Linear vs Lump Sum contracts with identical: A) Strikepoint; B) Premium and C) Expected Indemnity payment (i.e., same Expected Income)

## Income under **Linear Insurance**:

- $Y^L = Ap[(T - q) - \pi]$  if  $q \leq T$
- $Y^L = Ap(q - \pi)$  if  $q > T$
- T: strikepoint (qq/ha);  $\pi$ : premium (qq/insured ha)

## Income under **Lump Sum Insurance**:

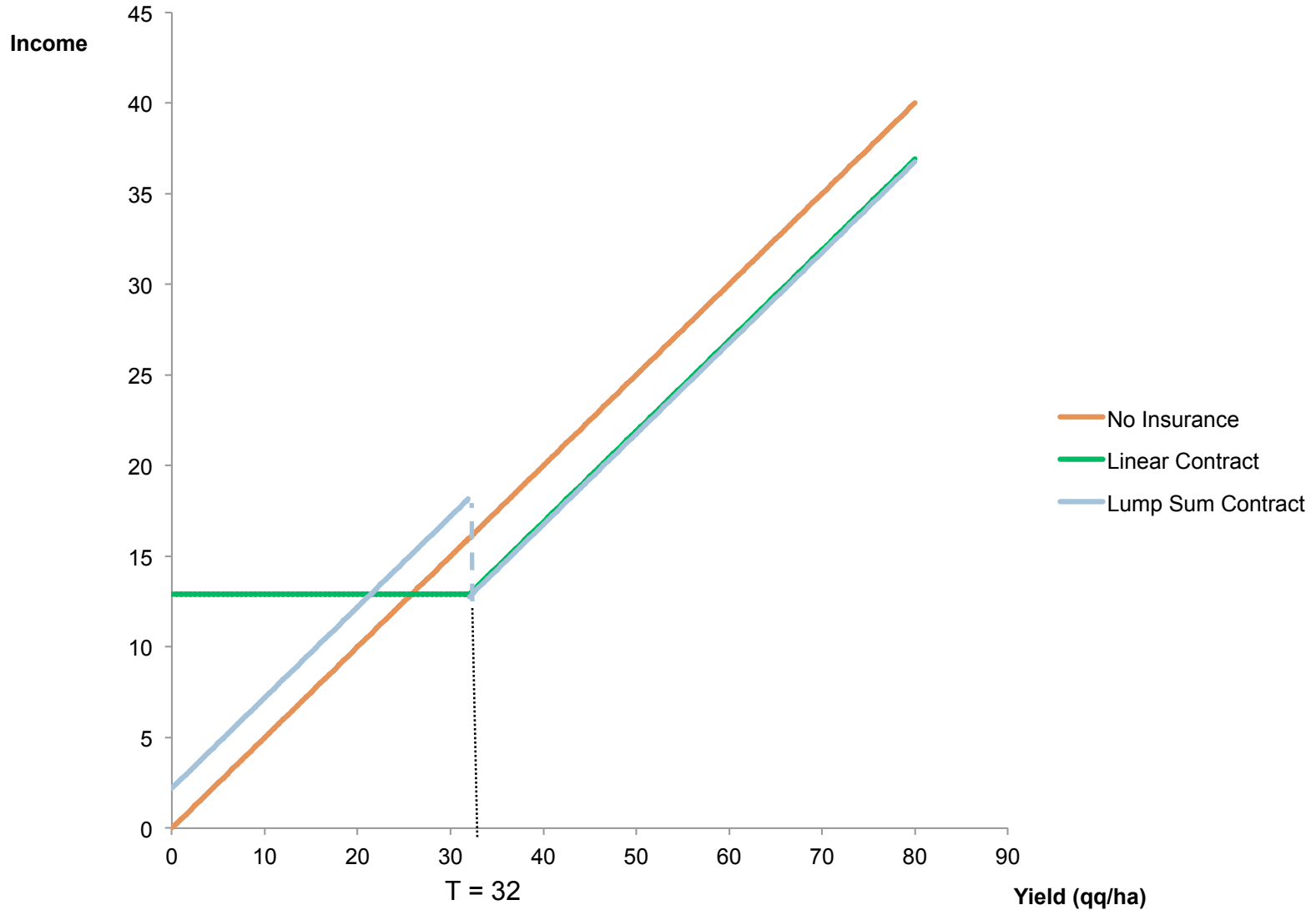
- $Y^S = Ap(q + s - \pi)$  if  $q \leq T$
- $Y^S = Ap(q - \pi)$  if  $q > T$
- s: Lump sum indemnity (qq/insured ha)

## Parameterize for Pisco

- A = 5 ha; p = 100 S./qq;
- T = 32 qq/ha;  $\pi$  = 620 S./ha; s = 1,060 S./ha

# Linear vs. Lump Sum Contracts

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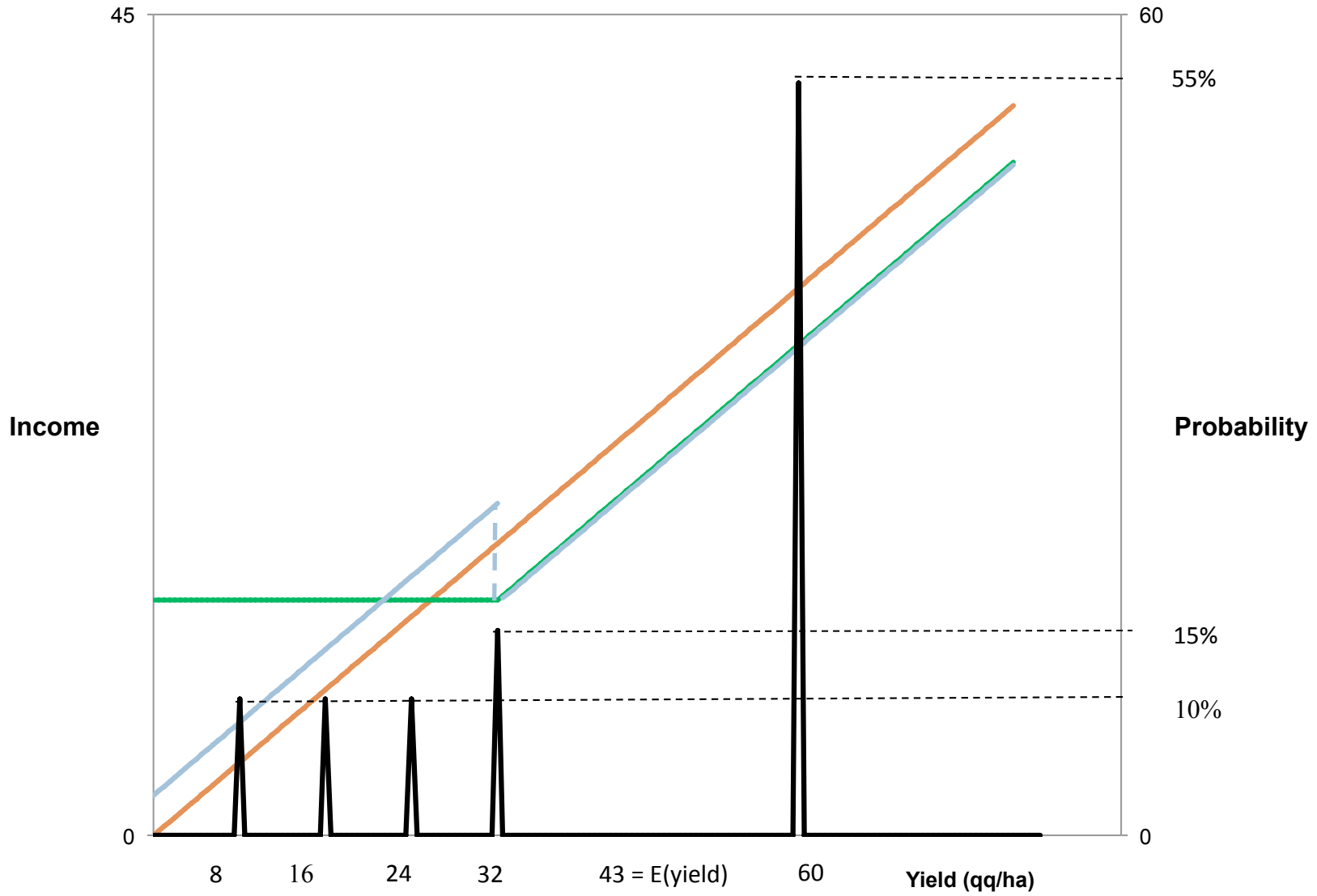
# Discrete Version

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- Discrete yield distribution with 5 possible outcomes:
  - Start with empirical distribution of average yield in Pisco;
  - Collapse all density above mean into 1 outcome with 55% prob;
  - Collapse density below mean into 5 outcomes with smaller probabilities;
  
- End up with:

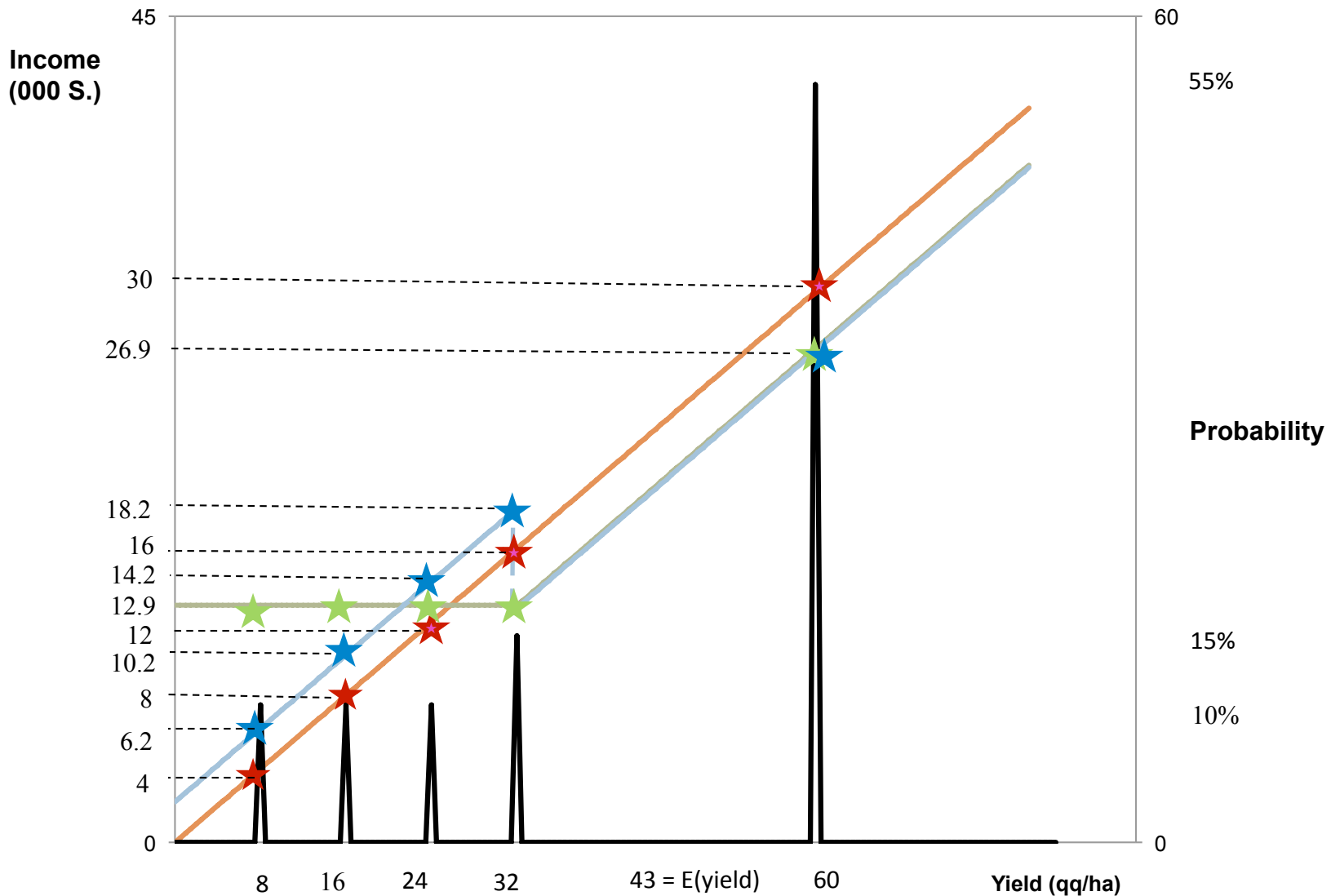
# Linear vs. Lump Sum Contracts

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# Linear vs. Lump Sum Contracts

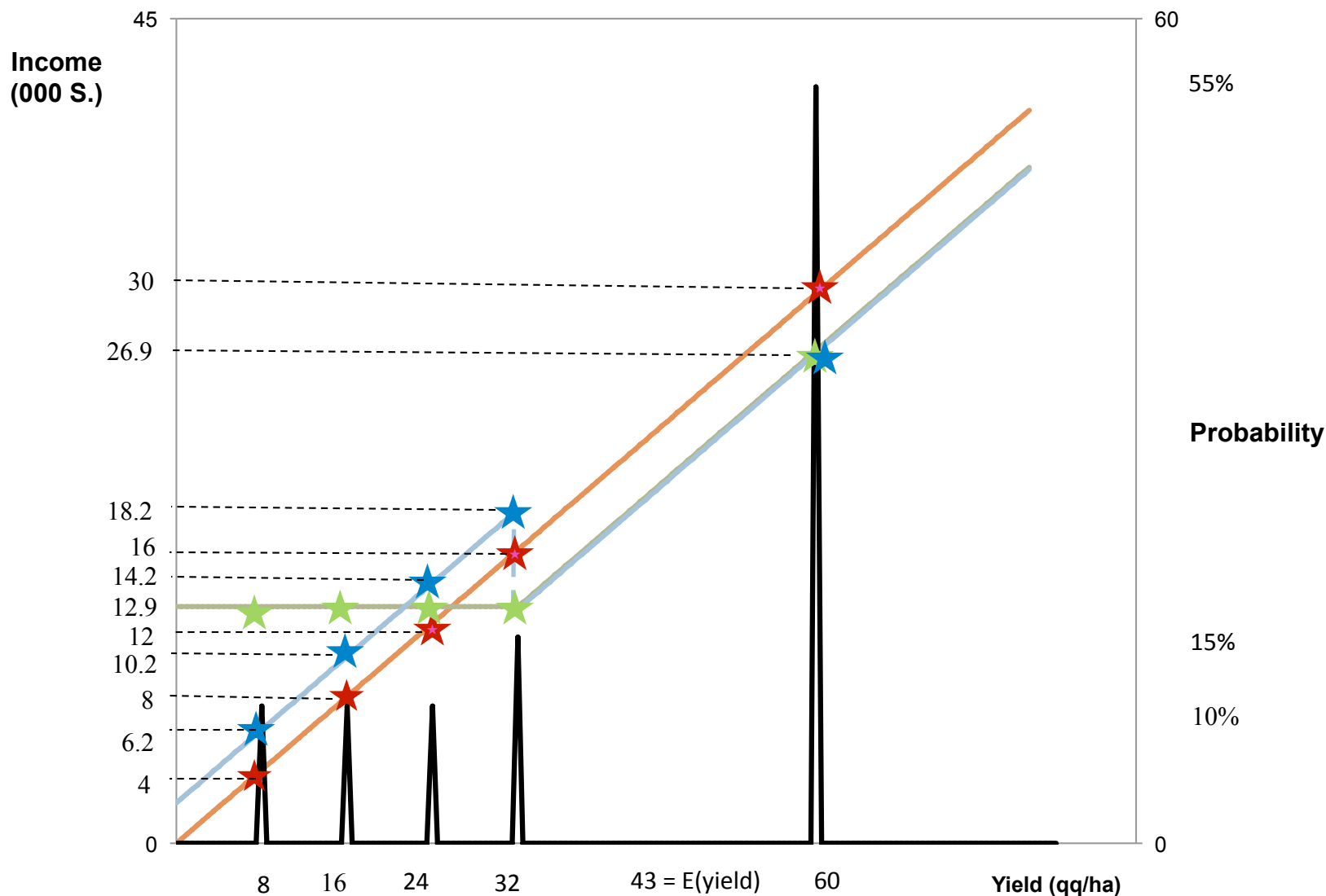
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□ How do we choose between Red vs. Green vs. Blue stars?

□ Need to see how insurance effects PMF of income.

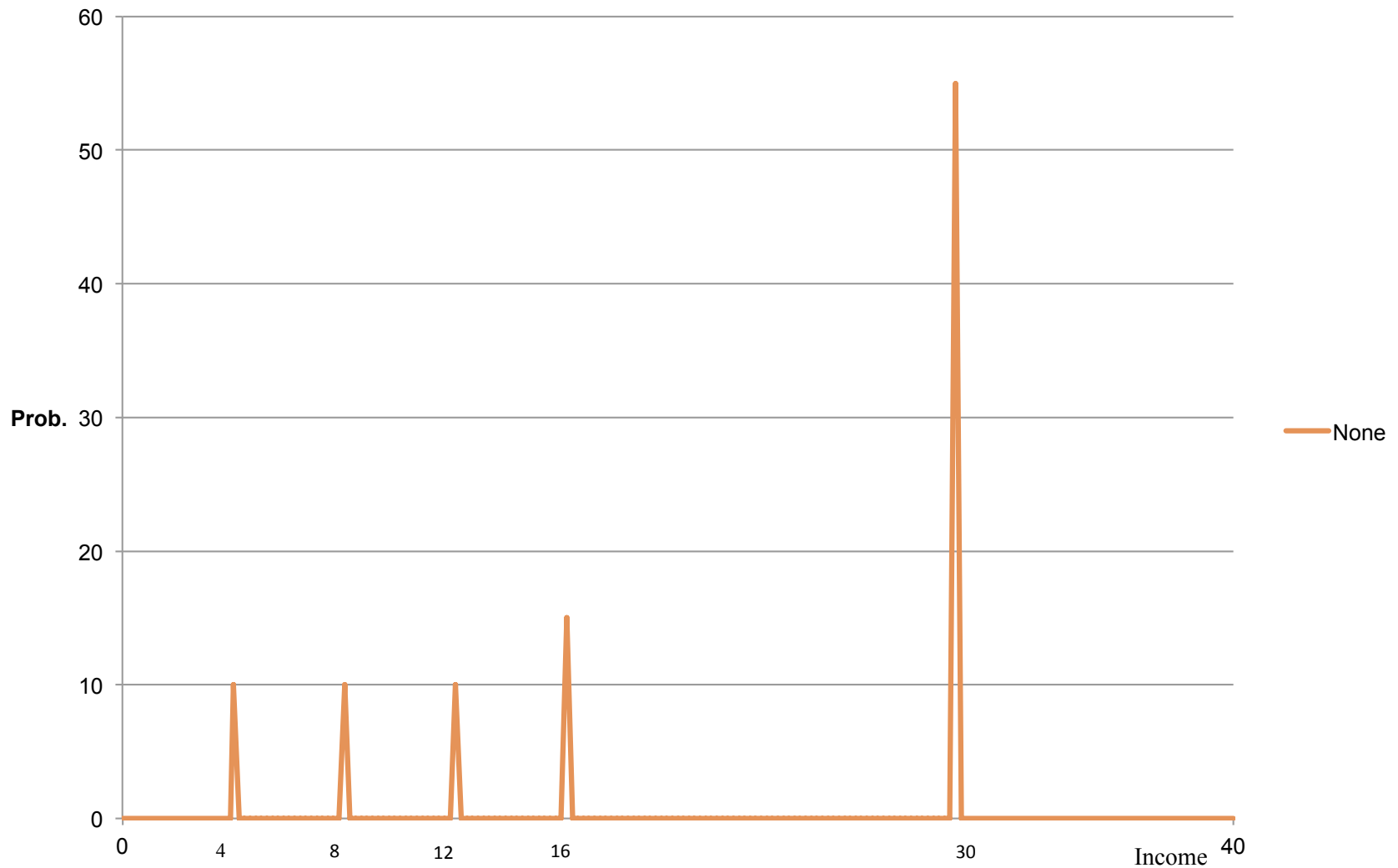
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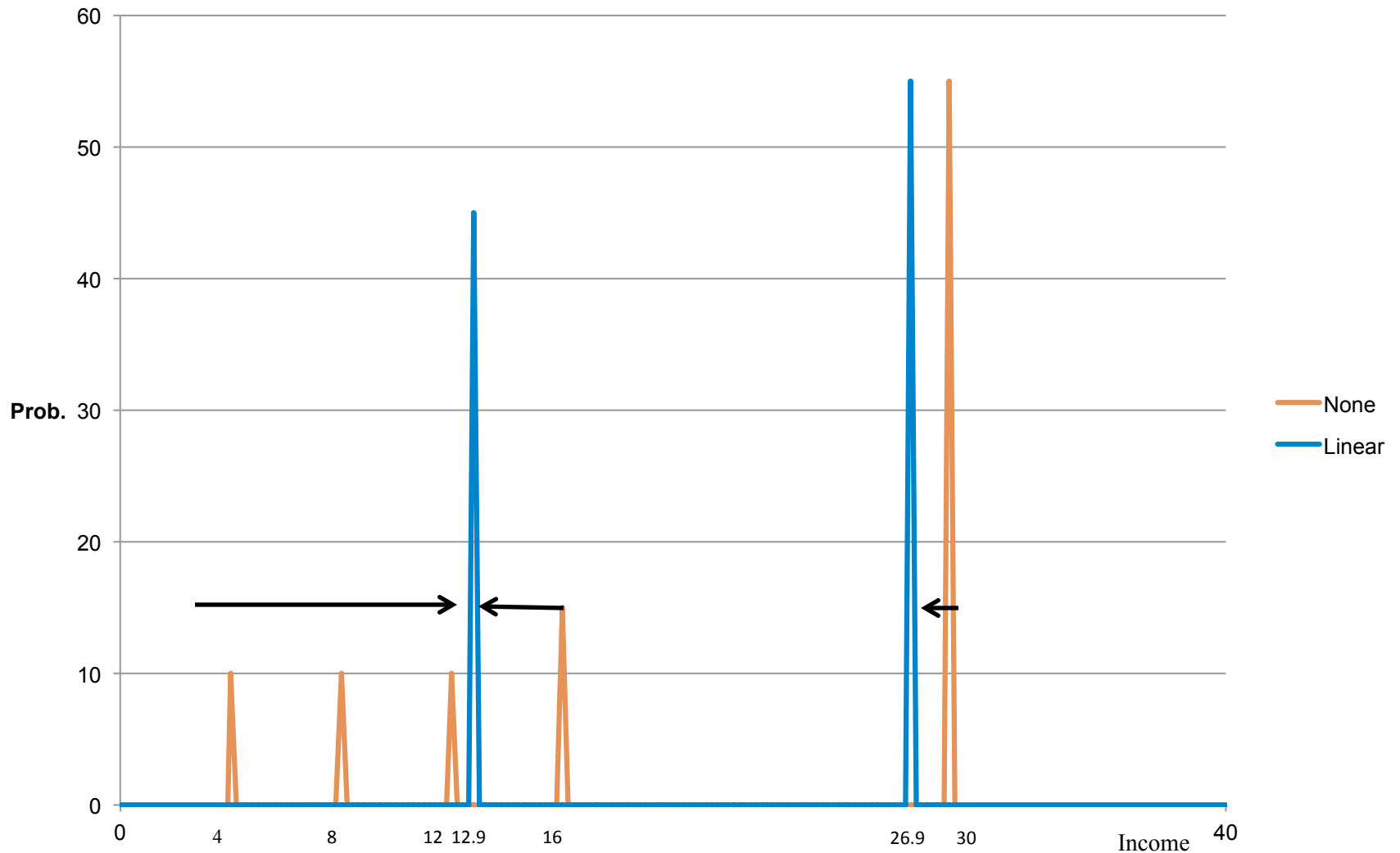
# PMF's of income under different contracts

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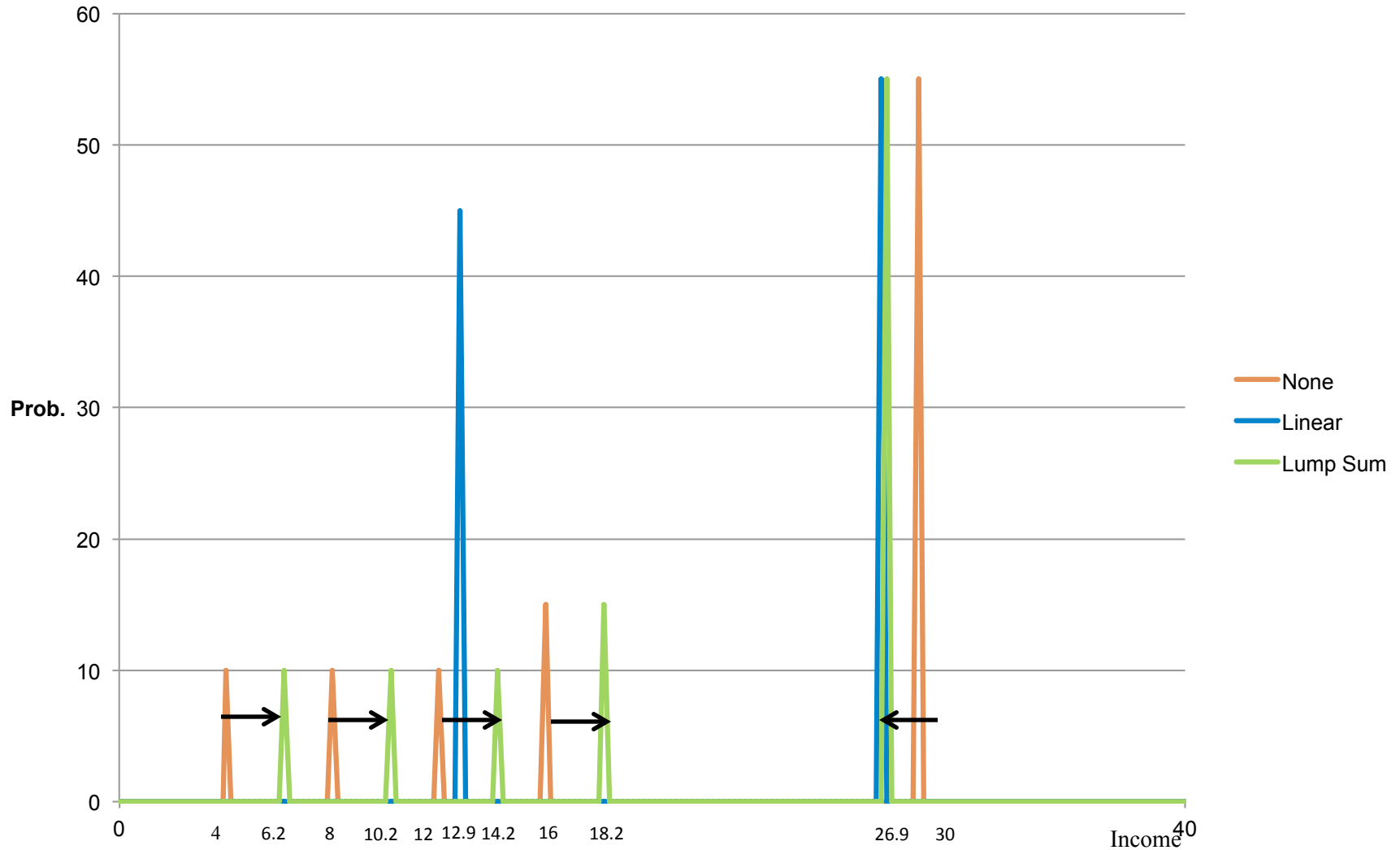
# PMF's of income under different contracts

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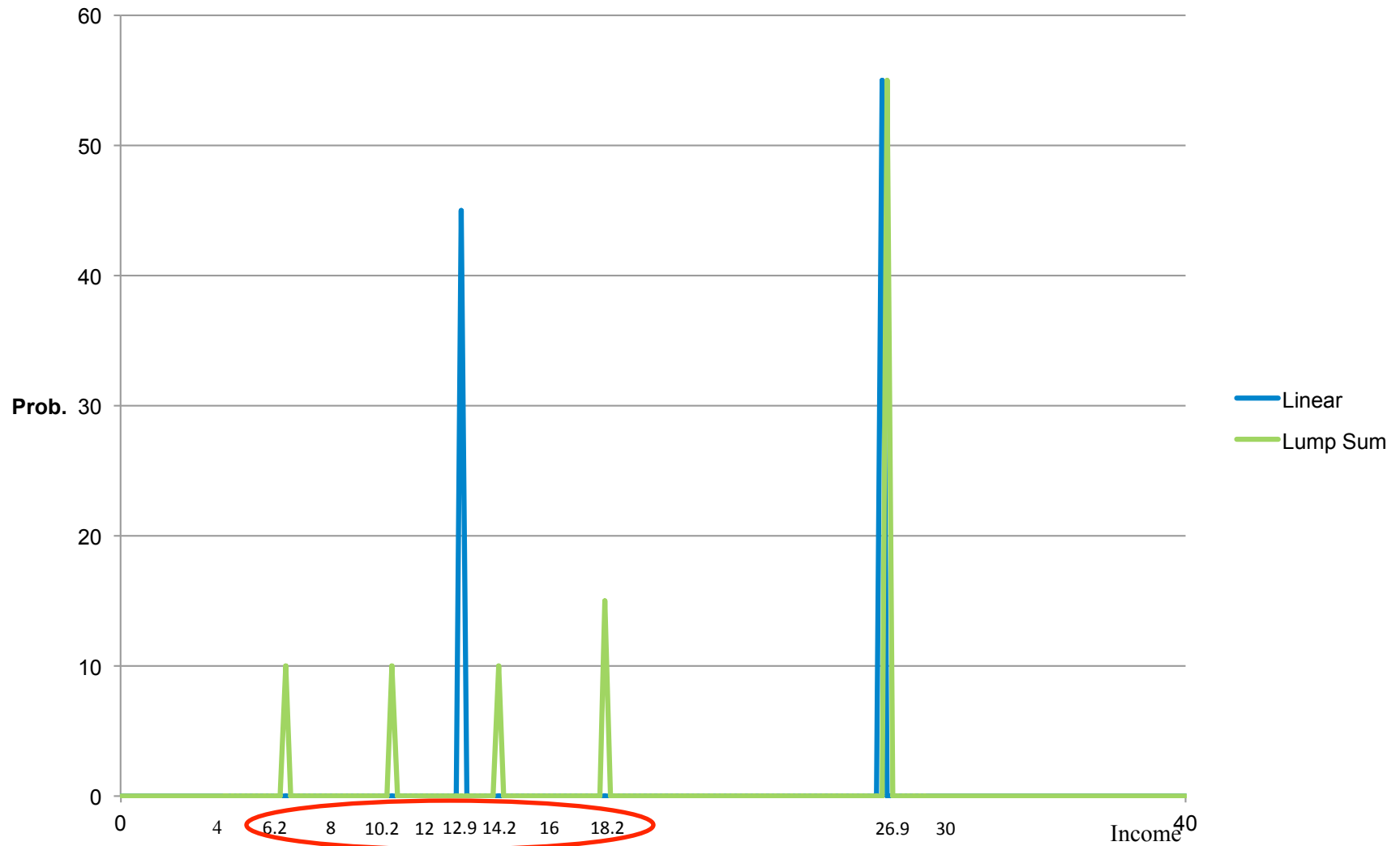
# PMF's of income under different contracts

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# PMF's of income under different contracts

12



# Contract choice under EUT versus CPT

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- What matters under EUT?
  - ▣ Degree of risk aversion
    - $\gamma$ : Coefficient of Relative Risk Aversion
  
- What matters under CPT?
  - ▣ Degree of risk aversion
  - ▣ Subjective probabilities
    - Decision weights assigned to each outcome may differ from objective probabilities
    - $\alpha$ : Coefficient from probability weighting function
  - ▣ Reference point and reflection
    - Do I treat “gains” systematically differently than “losses”
    - $R$ : Reference point above which lie gains, below which lie losses.
  - ▣ Loss aversion
    - Degree of asymmetry of valuation of losses versus gains
    - $\lambda$ : Coefficient of loss aversion

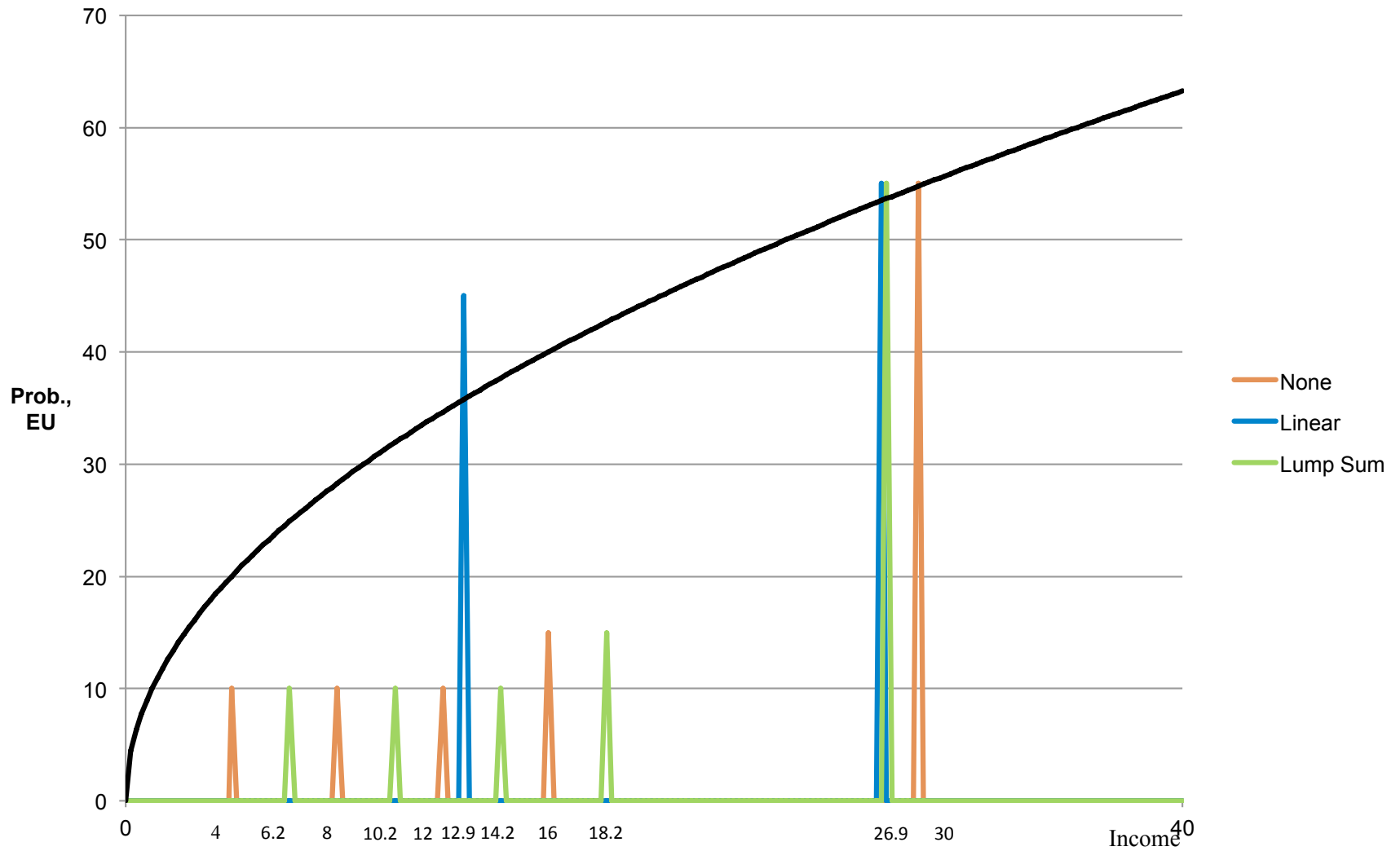
# Contract Choice under EUT

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- $u(Y) = Y^{1-\gamma}$ 
  - ▣ Constant Relative Risk Aversion
  - ▣  $\gamma$  is coefficient of relative risk aversion
  - ▣  $\gamma > 0 \rightarrow$  risk averse;  $\gamma < 0 \rightarrow$  risk loving
  
- Linear contract gives greater risk reduction than lump sum contract.
  
- Risk averse farmers will:
  - ▣ Never prefer lump sum to linear;
  - ▣ Buy linear if they are sufficiently risk averse ( $\gamma > \gamma^*$ ), such that risk premium  $>$  insurance premium.
  
- Risk neutral & risk loving farmers will:
  - ▣ Always prefer no-insurance
    - Highest variance;
    - Loading  $\rightarrow$  Highest  $E(Y)$

# Expected Utility Theory

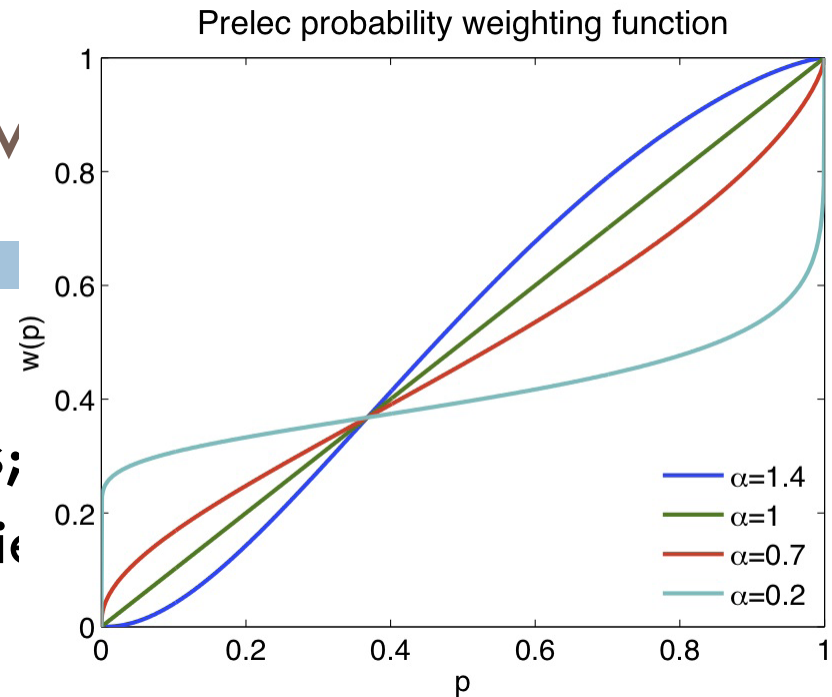
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# EUT Departure 1: Subjectiv

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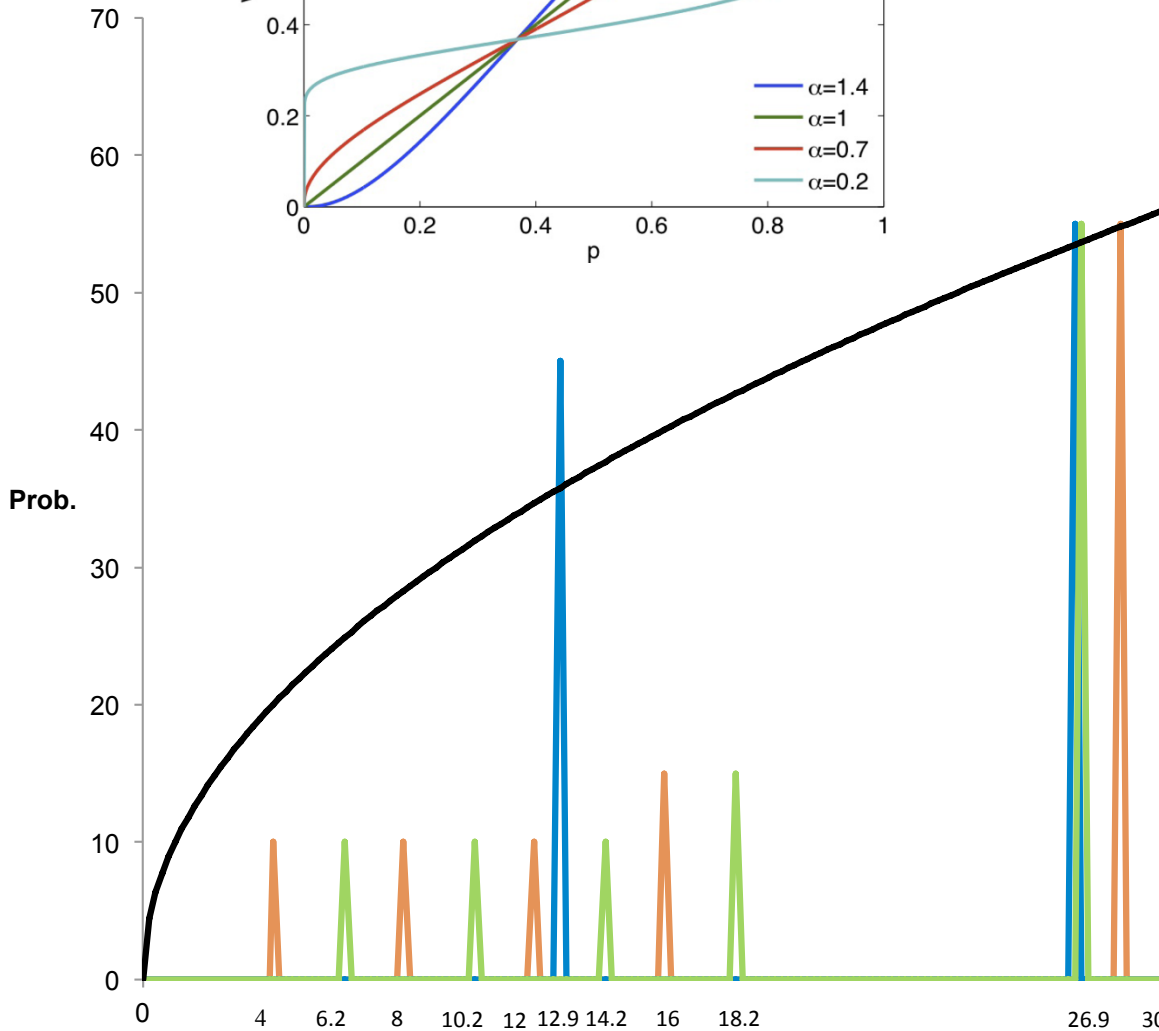
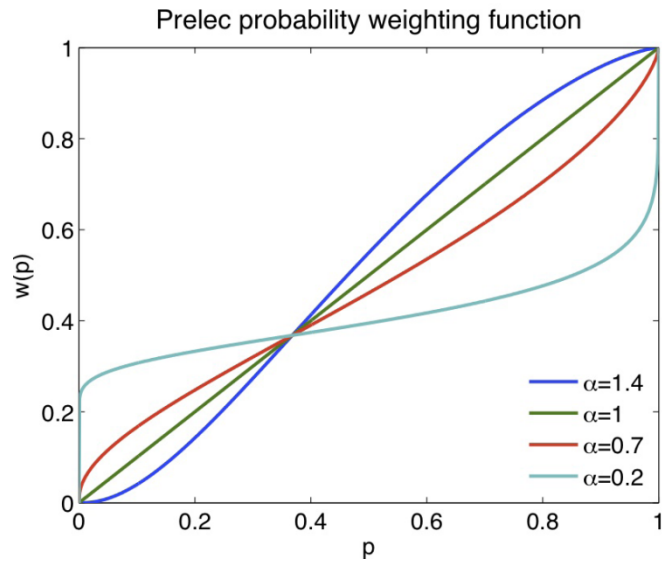
- People tend to:
  - Overweight small probabilities;
  - Underweight larger probabilities



- Probability weighting function from Prelec (1998):
  - $w(p) = \exp(-(-\ln(p))^\alpha)$
- Cumulative Prospect Theory (Kahneman & Tversky, 1992) transform  $w(p)$  into decision weights that:
  - Sum to 1;
  - Maintain monotonicity



# Impact of Prob. Weighting on Insurance Demand

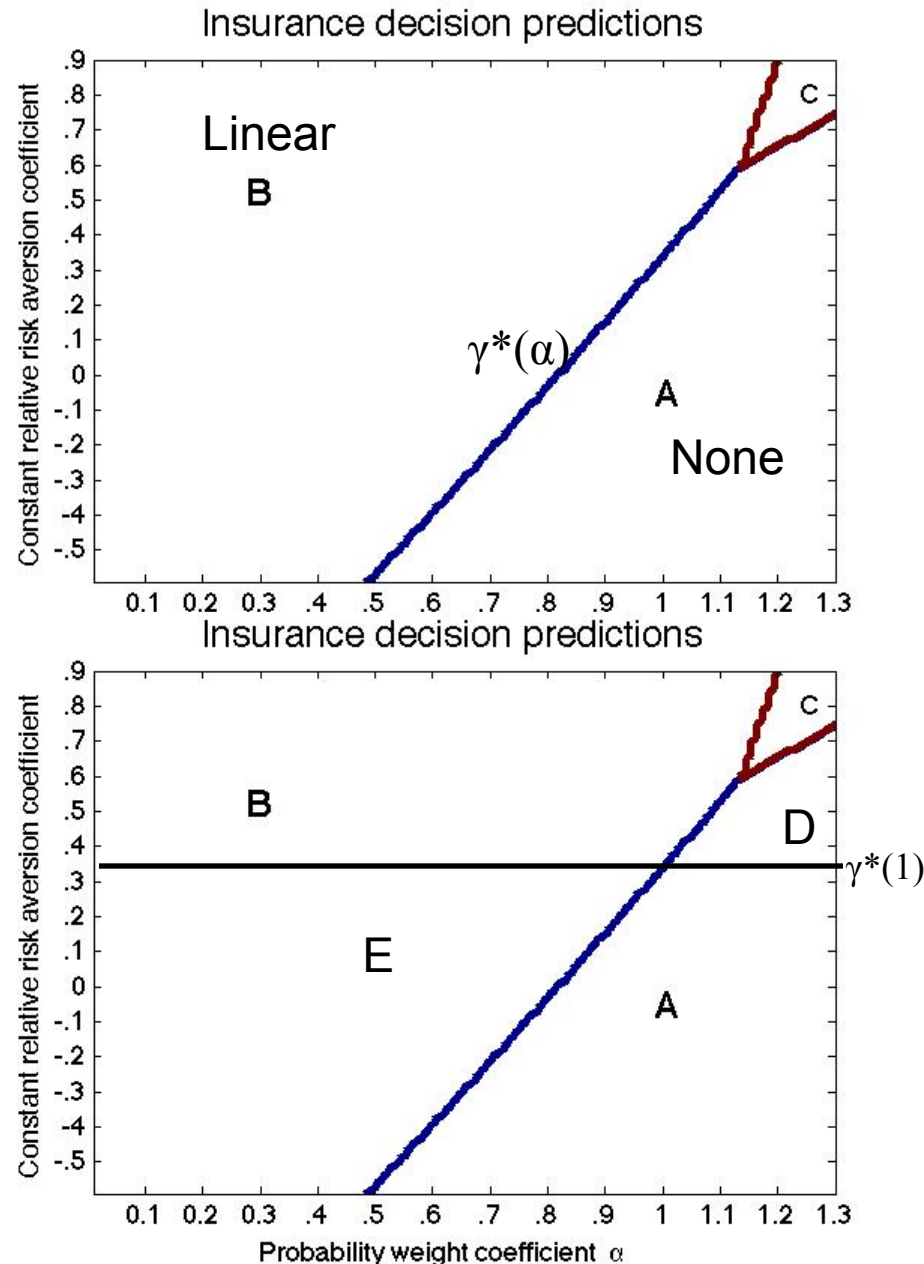


- In each option, relatively bad outcomes are lower prob.;
- Thus expected utility falls for ALL options as  $\alpha \rightarrow 0$
- Linear becomes *relatively more* attractive because it truncates lowest outcomes

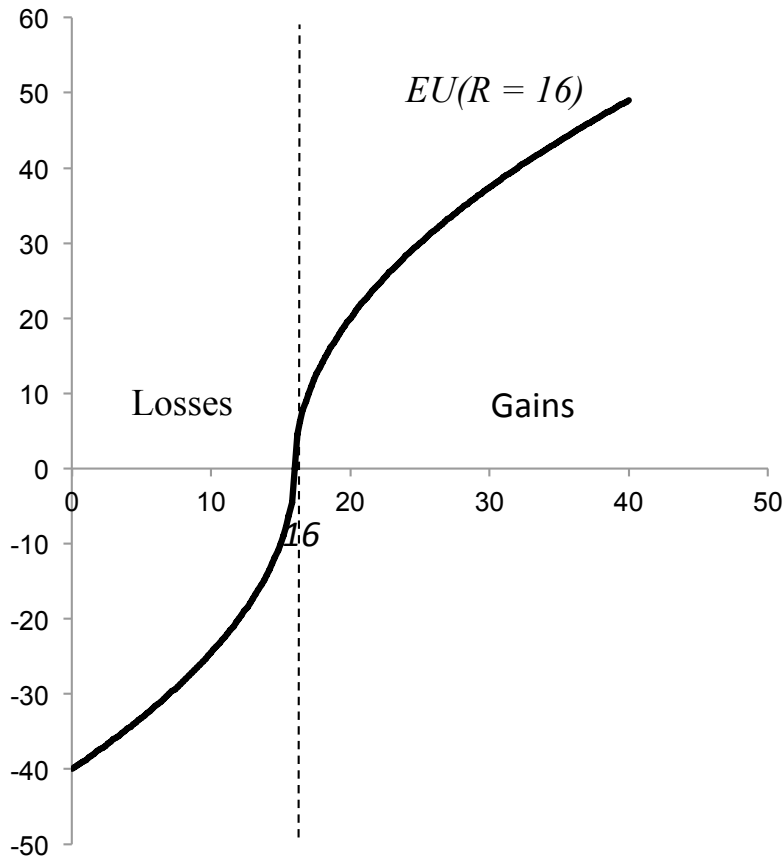
# Impact of Probability Weighting: Summary

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- $\gamma^*$  is CRRA such that indifferent between Linear & No contracts;
- $\partial\gamma^*/\partial\alpha > 0$ 
  - As  $\alpha$  falls from 1 to 0,
    - Linear becomes relatively more attractive
    - So marginally less risk averse people prefer Linear
  - As  $\alpha$  increases above 1
    - Overweight high prob events;
    - Linear becomes less attractive;
    - Eventually prefer Lump Sum (area C).
- Demand Flip-floppers?
  - E: None (EUT)  $\rightarrow$  Linear (CPT)
  - D: Linear (EUT)  $\rightarrow$  None (CPT)
  - C: Linear (EUT)  $\rightarrow$  Lump Sum (CPT)

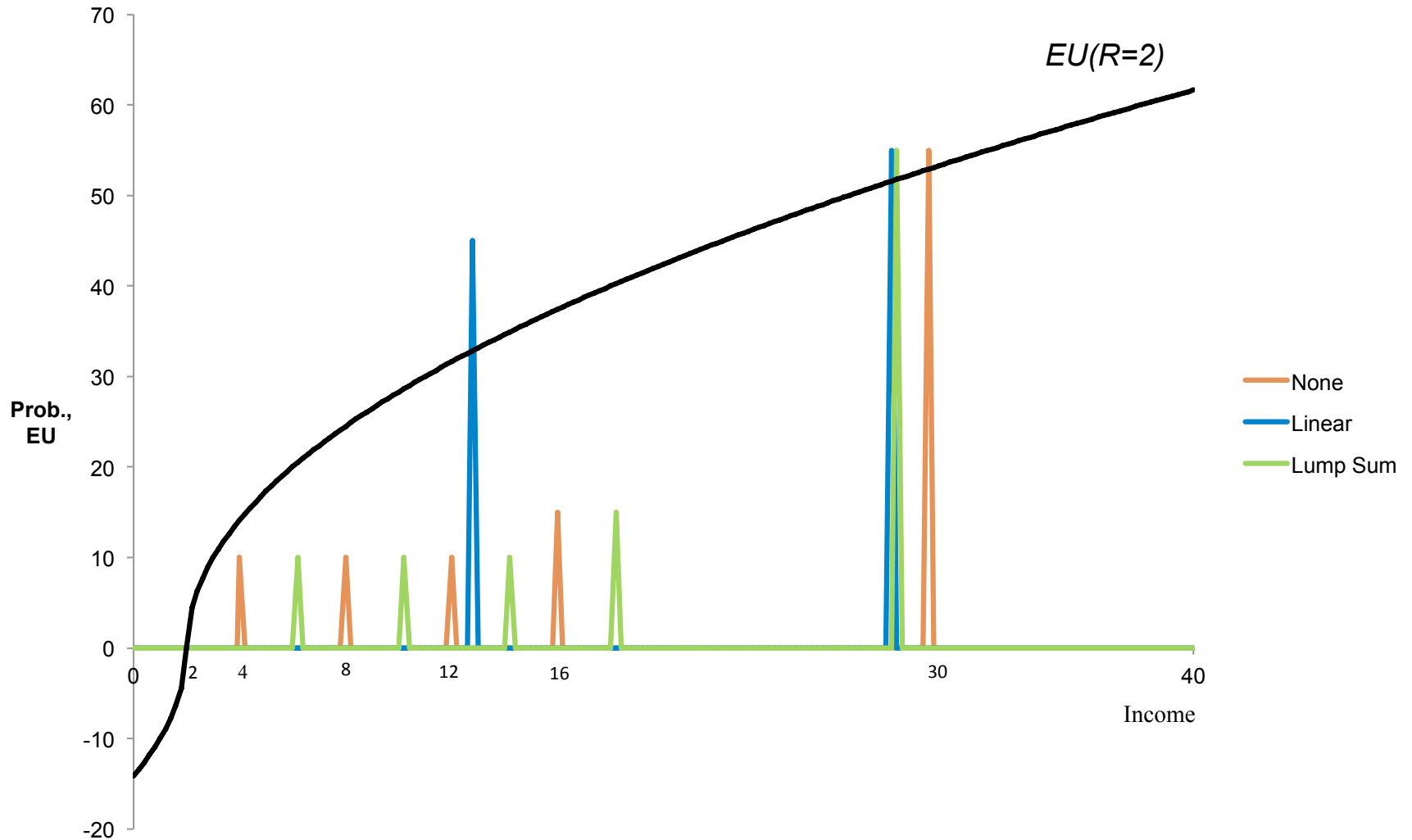


# Departure #2: Reflection & Reference Point



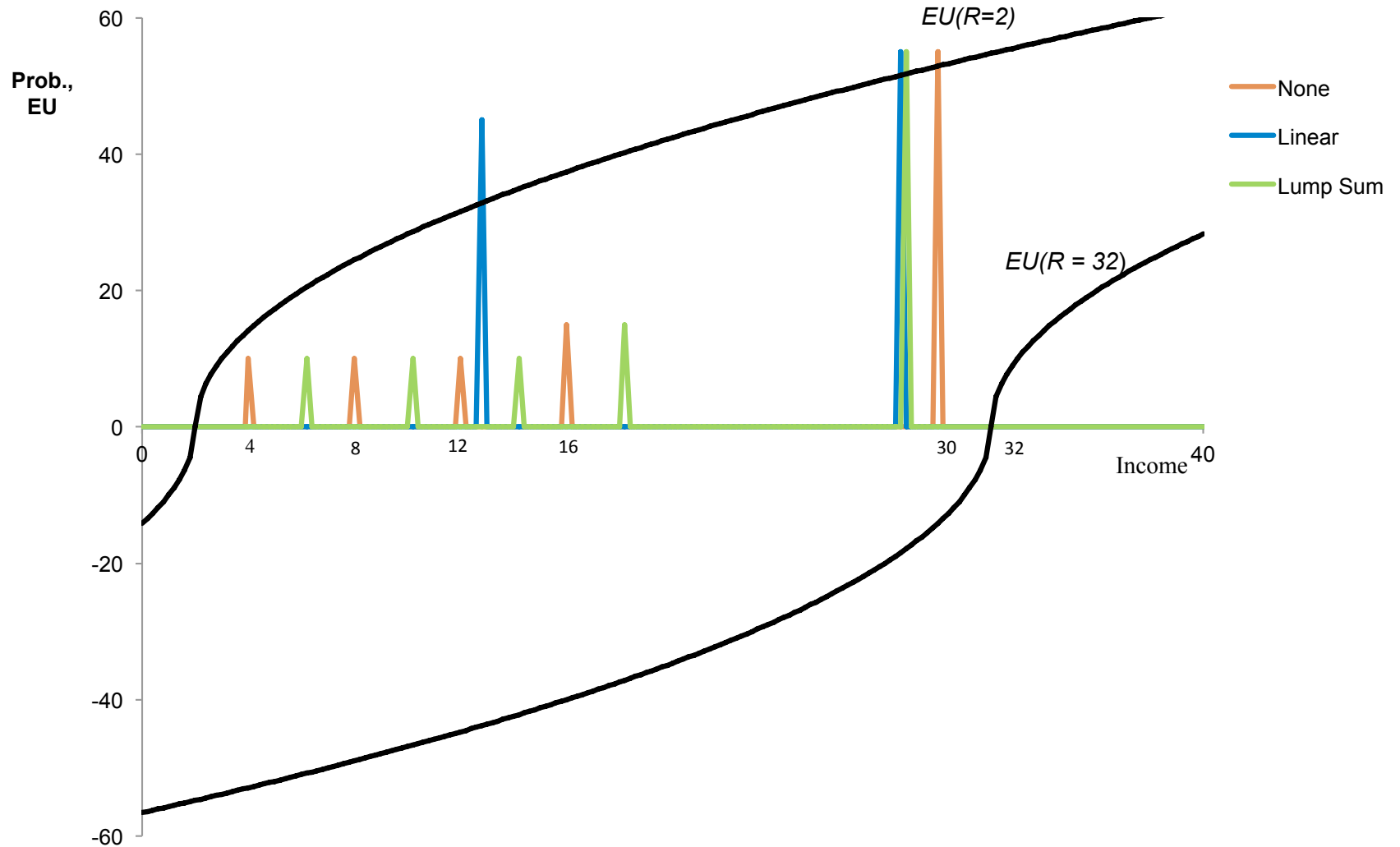
- $u(Y) = (Y-R)^{1-\gamma}$  if  $Y > R$
- $u(Y) = -((R-Y)^{1-\gamma})$  if  $Y < R$
  
- Utility function “reflected” around reference point,  $R$ .
  
- Risk averse behavior over “gains”
  
- Risk loving behavior over “losses”
  
- How does Reflection affect insurance demand?
  - Depends where  $R$  is...
  - (Wouter’s *Proposition 5*)

# Low R $\rightarrow$ Insurance evaluated over “gains”



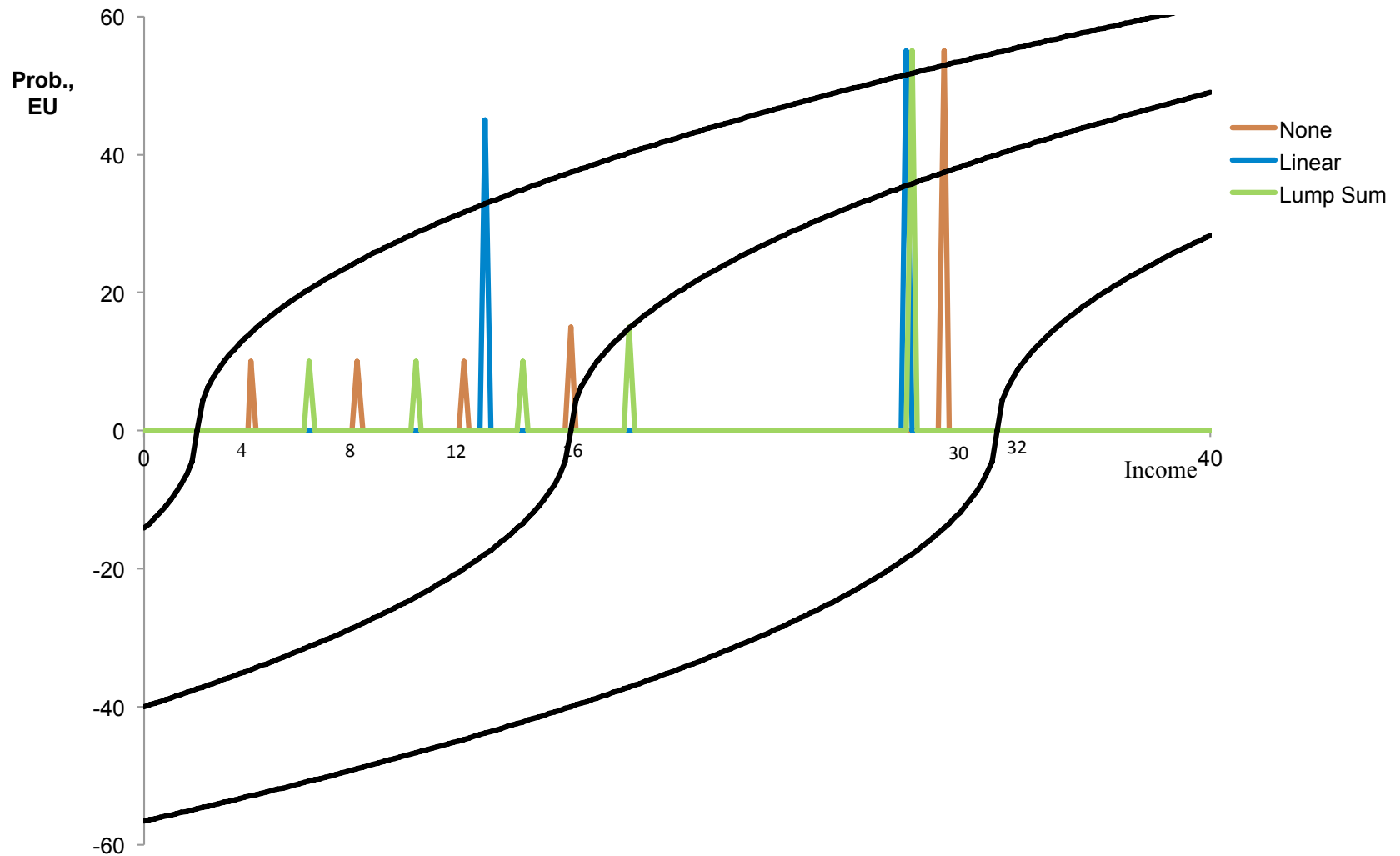
# High R $\rightarrow$ Insurance evaluated over “losses”

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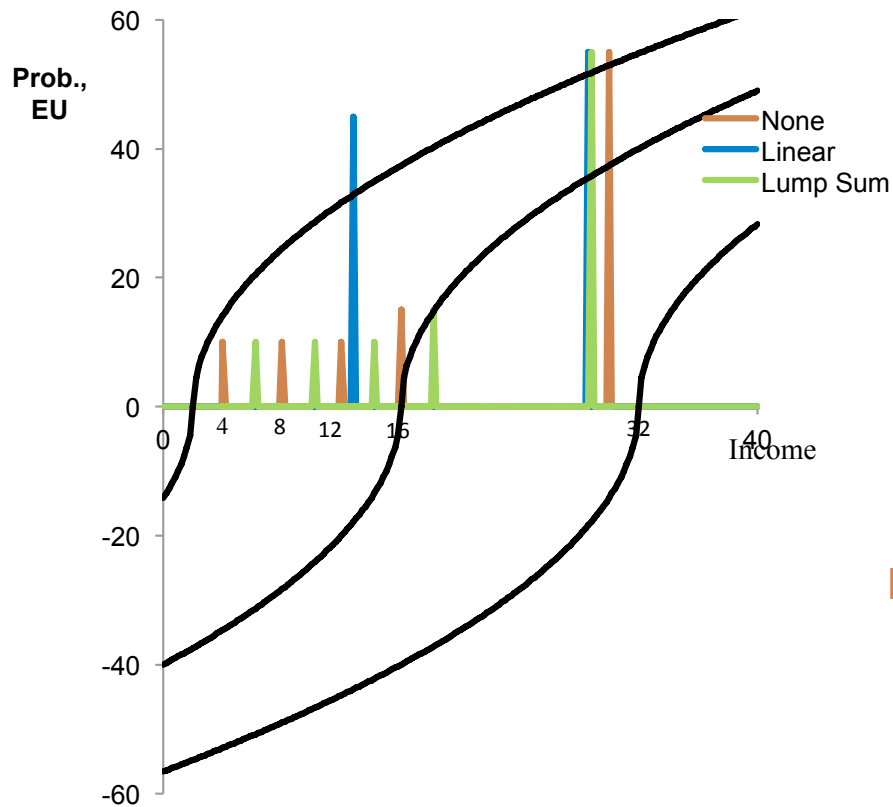
# Intermediate R $\rightarrow$ Insurance evaluated over “gains” & “losses”

22



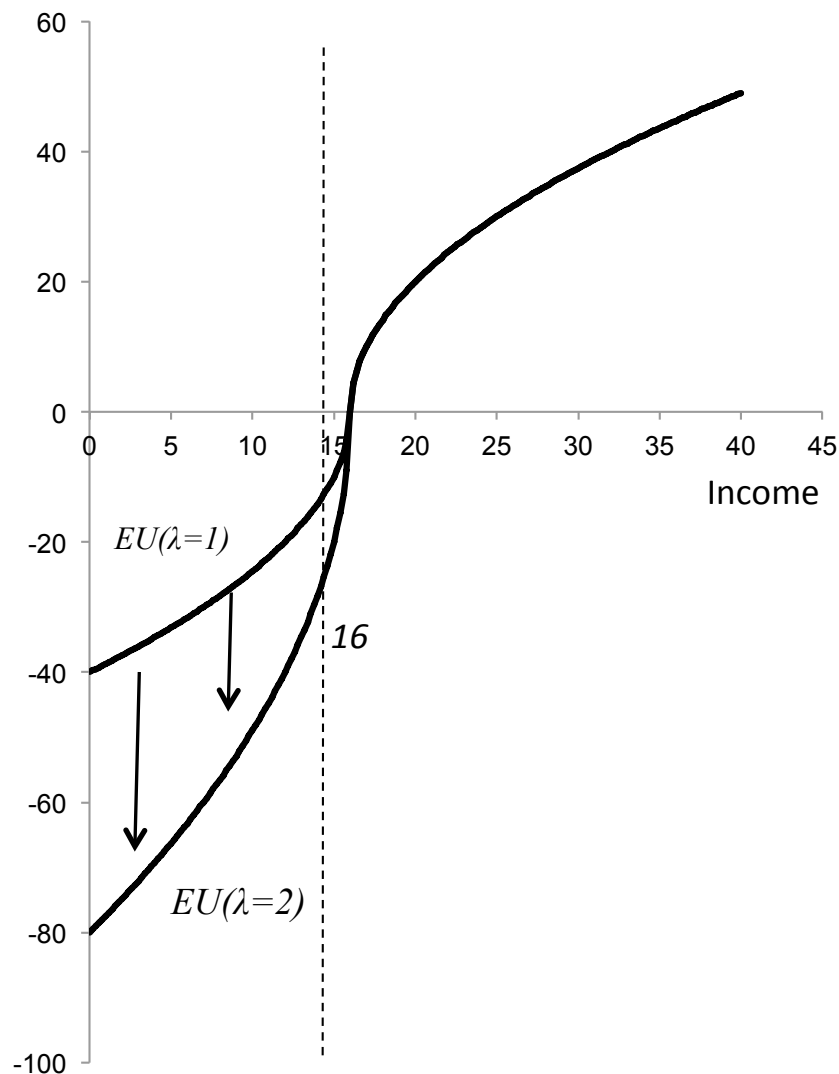
# Impact of Reference Point: Summary

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- As  $R$  increases:
  - Relatively more insured outcomes evaluated over losses;
  - Lump sum becomes relatively more attractive than linear;
  - Eventually no-insurance dominates
  
- In intermediate range (insured outcomes over both losses & gains), any ranking can obtain;

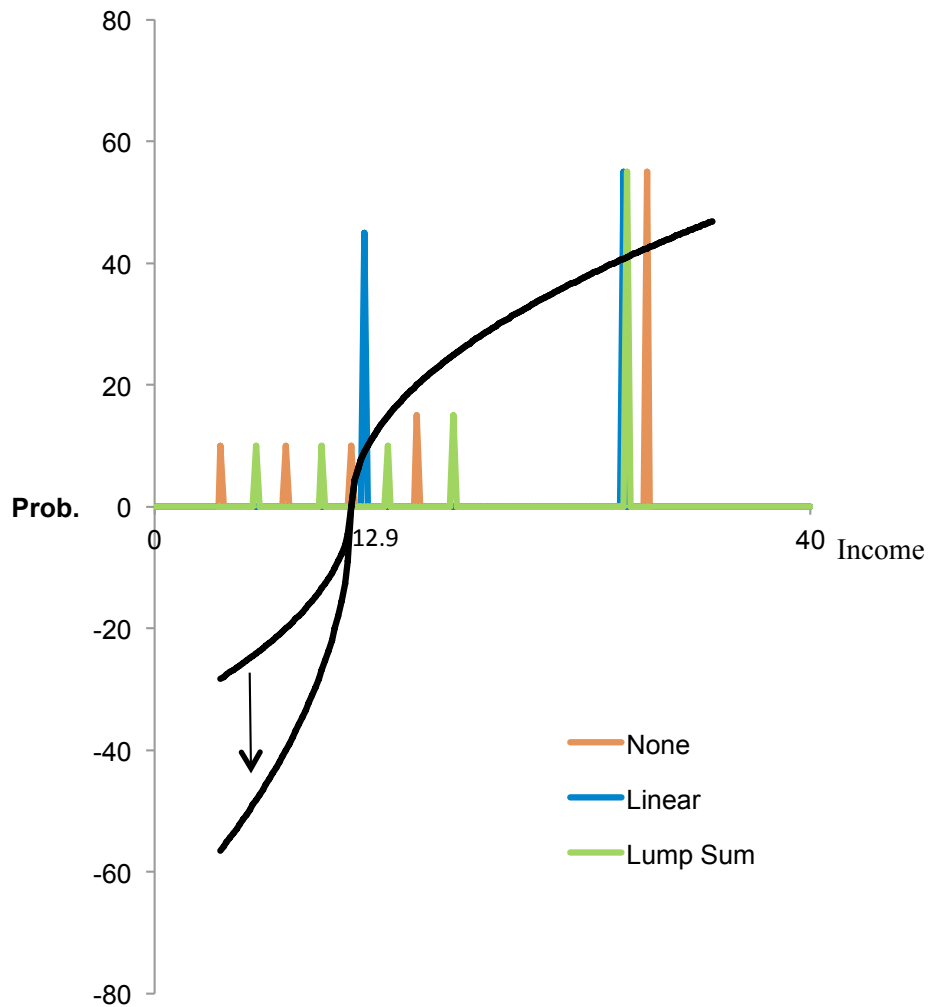
# Departure #3: Loss Aversion ( $\lambda$ )



- $u(Y) = (Y-R)^{1-\gamma}$  if  $Y > R$
- $u(Y) = -(\lambda(R-Y)^{1-\gamma})$  if  $Y < R$
  
- $\lambda$  introduces asymmetry in magnitude of loss and gain of given size;
  
- $\lambda > 1 \rightarrow$  Loss hurts more than a gain of equal size gain.
  
- How does  $\lambda$  affect insurance demand?
  - It depends on  $R$  (Wouter's Proposition 6 ☺)

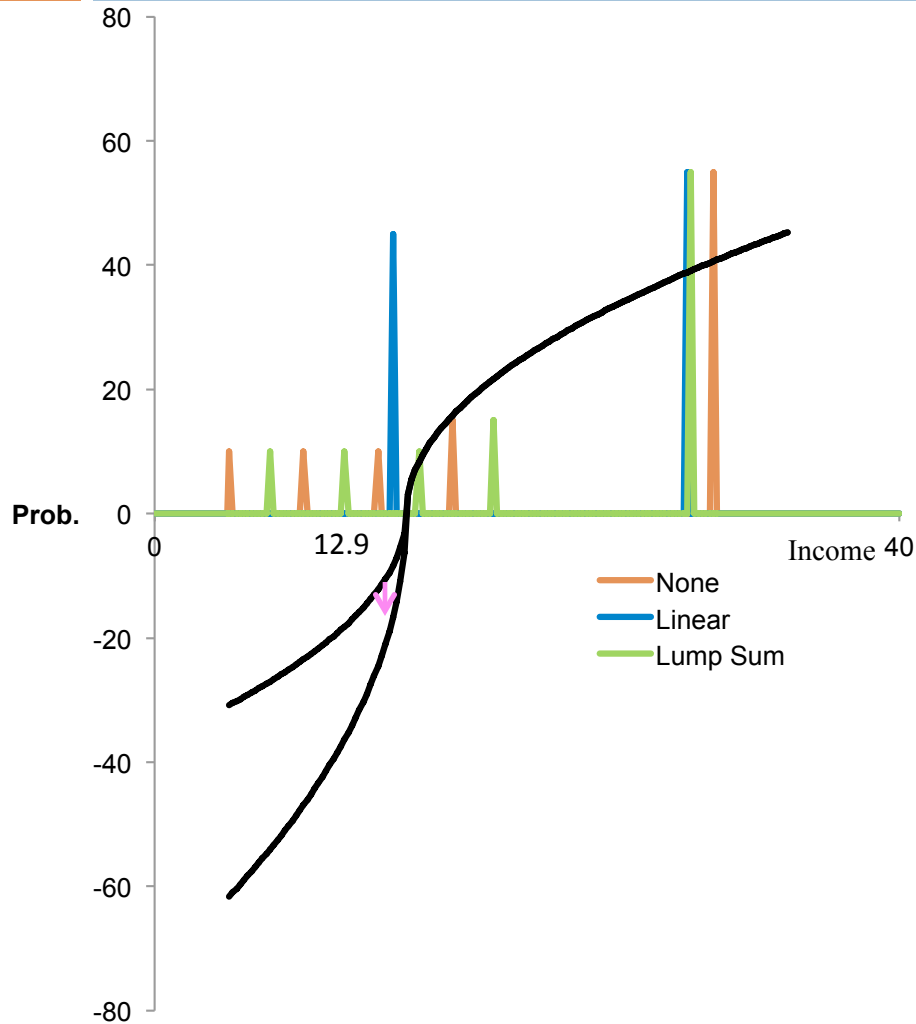


$$R < 12.9 = A\rho q(T - \pi)$$



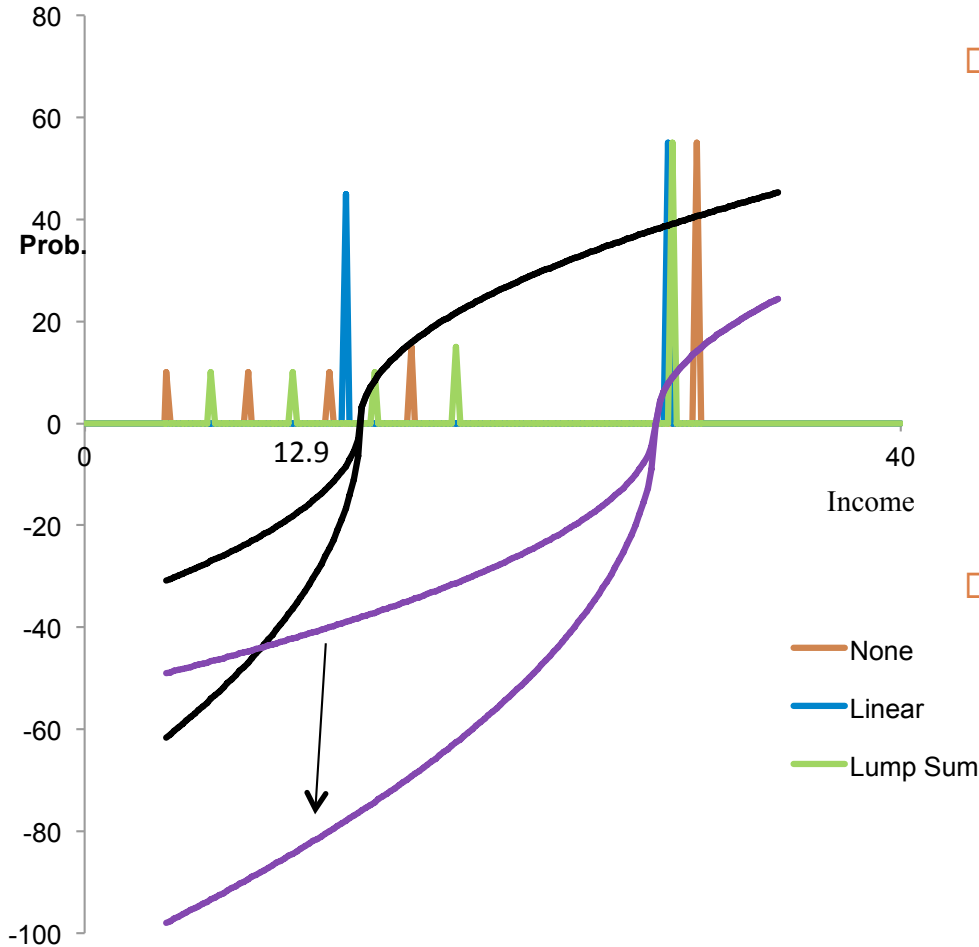
- Impact of  $\uparrow\lambda$  on EU:
  - No effect under LC;
  - Falls under LS;
  - Falls more under NC.
  
- Impact of  $\uparrow\lambda$  on demand:
  - Can flip from LS  $\rightarrow$  LC or NC  $\rightarrow$  LC if LS initially preferred.
  - No impact if LC initially preferred.

$$R = 12.9 + \varepsilon = Apq(T - \pi) + \varepsilon$$



- Impact of  $\uparrow\lambda$  on EU:
  - Falls under LSC;
  - Falls more under NC;
  - Falls less under LC (b.c. losses under LC are very small)
  
- Impact of  $\uparrow\lambda$  on demand (same):
  - Makes LC relatively more attractive than LSC.
  - Can flip from LS  $\rightarrow$  LC or NC  $\rightarrow$  LC if LS initially preferred.

$$R = 12.9 + \varepsilon = Apq(T - \pi) + \varepsilon$$



- Impact of  $\uparrow\lambda$  on EU:
  - Falls under LS;
  - Falls more under NC;
  - Also falls more under LC (b.c. as R shifts right, payout at 12.9 becoming larger and larger loss)
  
- Impact of  $\uparrow\lambda$  on demand (same):
  - Makes LSC relatively more attractive than both LC and NC.
  - Can flip from LC  $\rightarrow$  LS or NC  $\rightarrow$  LS if LS initially preferred.

# *CPT Summary*

- Probability weighting ( $\alpha$ )
  - ▣ Over-weighting low probability events makes both insurance contracts more attractive;
  - ▣ As over-weighting increases (i.e.,  $\alpha$  falls from 1 towards 0), linear contract becomes relatively more attractive than lump sum.
  
- Reflection and Reference point ( $R$ )
  - ▣ Reflection turns risk averse farmers into risk seekers over losses
  - ▣  $\uparrow R \rightarrow$  Lump sum becomes relatively more attractive than linear
  
- Loss Aversion;
  - ▣  $\uparrow \lambda \rightarrow$  Makes lump sum more attractive than linear if  $R < R^*$
  - ▣  $\uparrow \lambda \rightarrow$  Makes linear more attractive than lump sum if  $R > R^*$
  
- So...anything can happen! If only we knew the value of farmers' preference parameters??!

# Framed field experiments in Pisco



# First Activity: Preference Parameter Elicitation

- Method from Tanaka, Camerer & Nguyen (2010).
- Farmers play 3 unframed lottery games;
- In each lottery, observe “switch point” between two options;
- The three switch points determine farmer-specific values of:  $\gamma, \alpha, \lambda$



# Preference Parameters

- Method from Tanaka et. al. (AER 2010).
- Farmers play 3 unframed lottery games;
- In each lottery, observe “switch point” between two options;
- Three switch points determine farmer-specific values of:  $\gamma, \alpha, \lambda$

Opción A	
	10
	9
	8
	7
3	6
2	5
1	4

Opción B	
	10
	9
	8
	7
	6
	5
	4
	3
1	2

Opción C	
9	
8	
7	
6	
5	
4	
3	
2	
1	10

Opción D	
7	
6	
5	
4	
3	10
2	9
1	8

Opción E	
5	10
4	9
3	8
2	7
1	6

Opción F	
5	10
4	9
3	8
2	7
1	6

Línea 27	25 Pesos	- 4 Pesos
Línea 28	4 Pesos	- 4 Pesos
Línea 29	1 Pesos	- 4 Pesos
Línea 30	1 Pesos	- 4 Pesos
Línea 31	1 Pesos	- 8 Pesos
Línea 32	1 Pesos	- 8 Pesos
Línea 33	1 Pesos	- 8 Pesos

30 Pesos	- 21 Pesos
30 Pesos	- 21 Pesos
30 Pesos	- 21 Pesos
30 Pesos	- 16 Pesos
30 Pesos	- 16 Pesos
30 Pesos	- 14 Pesos
30 Pesos	- 11 Pesos

# Second Activity: Two Insurance Demand Games

- Game over gains:
  - ▣ 5 yield outcomes (values and probabilities as described above).
  - ▣ Game payouts framed as revenues, thus always positive.
  
- Game over losses:
  - ▣ Same yield outcomes and probabilities.
  - ▣ Payouts framed as profits.
  - ▣ If yields fall below 32 qq/ha, revenues don't cover costs → losses.
  - ▣ Operationalized by giving farmer a 16 S/. “coupon”
    - It's their “reward” for playing this new game.
    - If they suffer a loss, they **must pay us** out of their coupon.
    - Makes farmer suffer/experience a true loss;
    - Makes real payoffs identical across the two games;
    - Avoids real out-of-pocket losses;
  
- Thus we force the Reference Point to = 0 in both games.



1. Rondas de práctica. 1. Opción \_\_ 2. Opción \_\_ 3. Opción \_\_ 4. Opción \_\_ 5. Opción \_\_ 6. Opción \_\_ 7. Opción \_\_

Probabilidades (pelotas) de cada evento					1
					2
					3
					4
					5
					6
					7
					8
	19	17	15	12	9
	20	18	16	13	10
				14	11
Rendimiento	<b>8 qq/ha</b>	<b>16 qq/ha</b>	<b>24 qq/ha</b>	<b>32 qq/ha</b>	<b>60 qq/ha</b>
Opción A	S/. 4 000				
Opción B	S/. 12 900				
Opción C	S/. 6 200				

7

Número del participante: \_\_\_\_\_

3. Rondas de práctica. 1. Opción \_\_ 2. Opción \_\_ 3. Opción \_\_ 4. Opción \_\_ 5. Opción \_\_ 6. Opción \_\_ 7. Opción \_\_

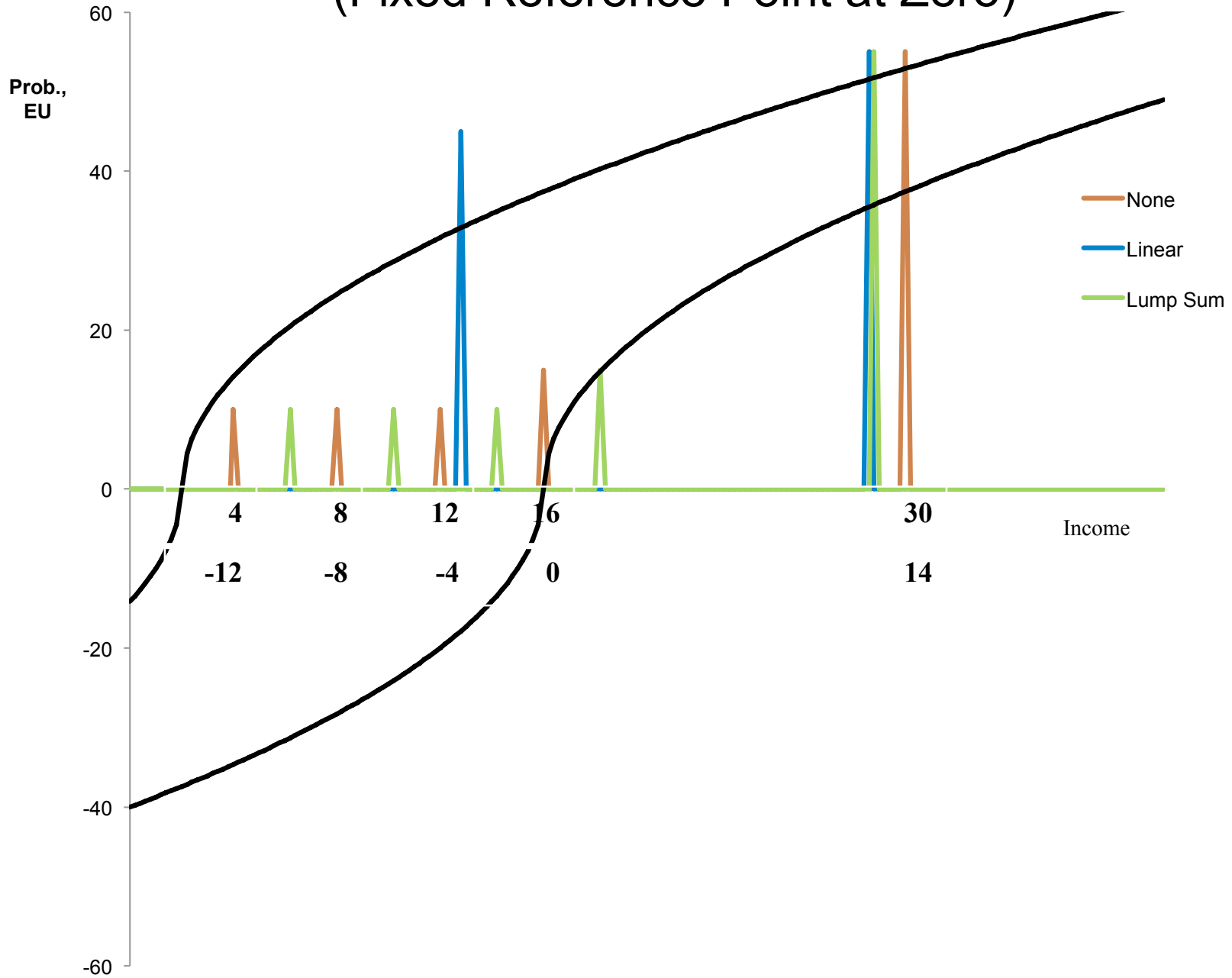
Probabilidades (pelotas) de cada evento					1
					2
					3
					4
					5
					6
					7
					8
	19	17	15	12	9
	20	18	16	13	10
				14	11
Rendimiento	<b>8 qq/ha</b>	<b>16 qq/ha</b>	<b>24 qq/ha</b>	<b>32 qq/ha</b>	<b>60 qq/ha</b>
Opción A	S/. - 12 000	S/. - 8 000	S/. - 4 000	S/. cero	S/. 14 000
Opción B	S/. - 3 100	S/. - 3 100	S/. - 3 100	S/. - 3 100	S/. 10 900
Opción C	S/. - 9 800	S/. - 5 800	S/. - 1 800	S/. 2 200	S/. 10 900

2. Su decisión final: Opción \_\_\_\_\_

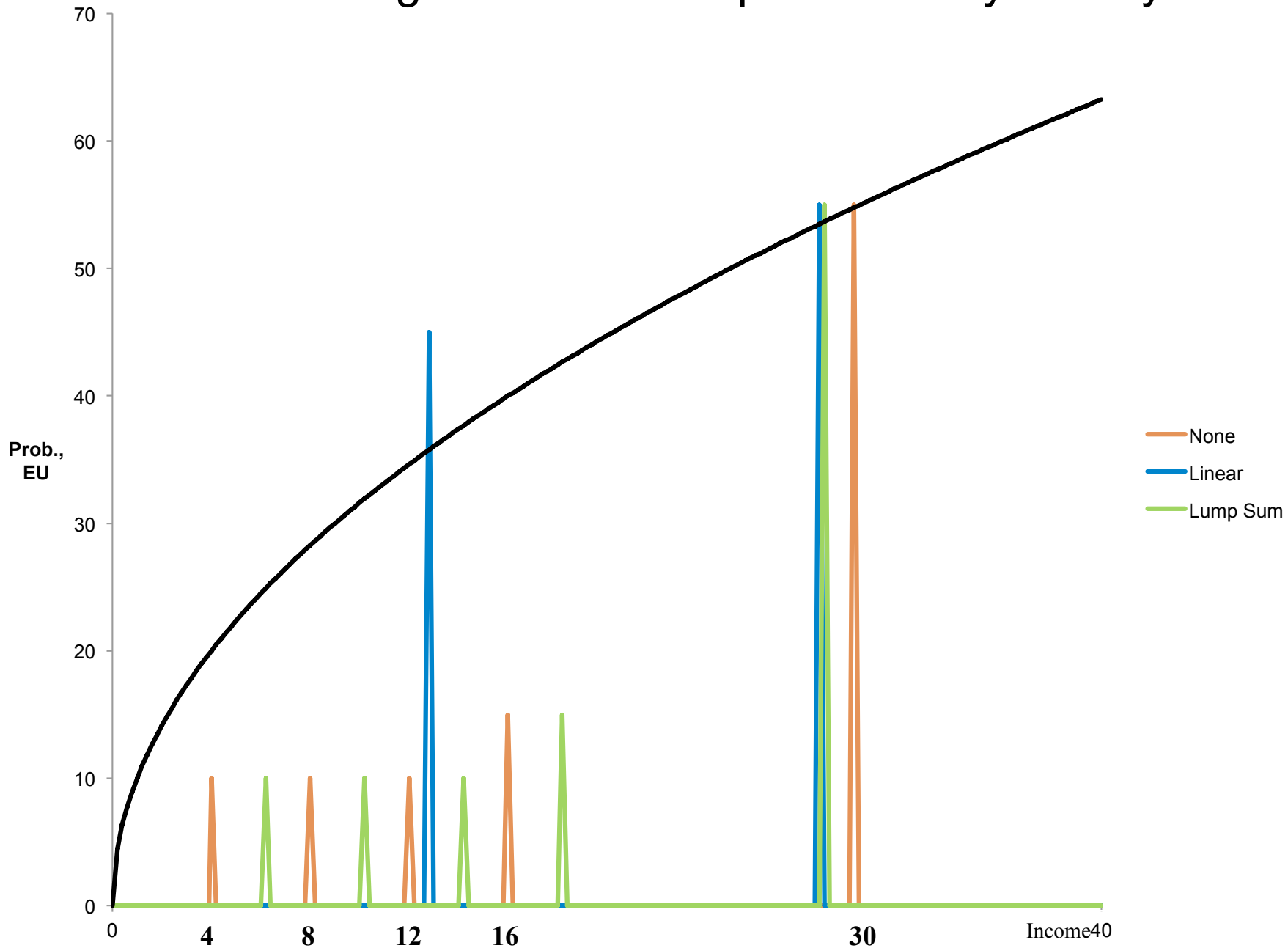
Nubia is describing payoffs from Lump Sum contract (“Option C”) under gains.



# View of games under Prospect Theory (Fixed Reference Point at Zero)



# View of games under Expected Utility Theory



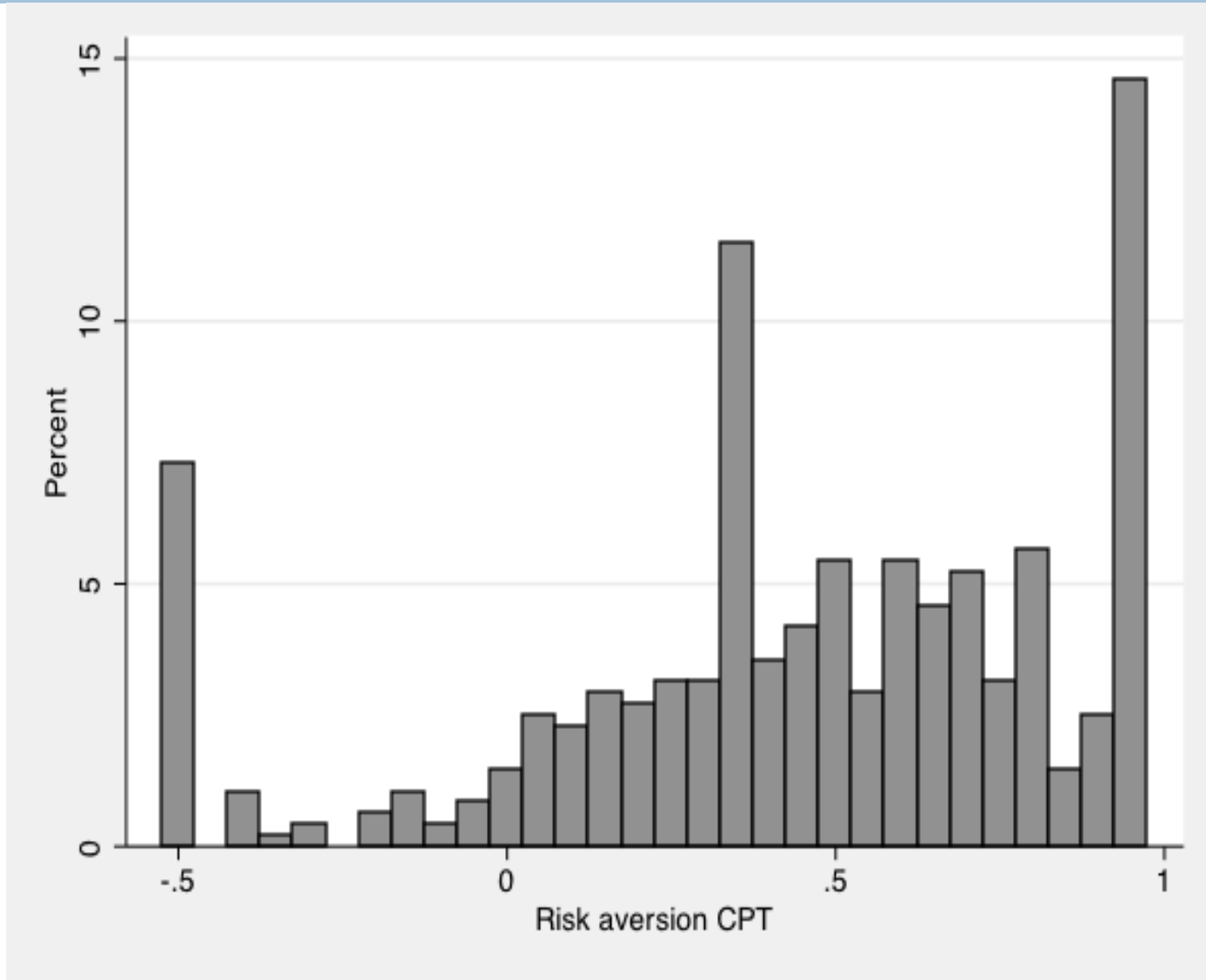
# Sample/Fieldwork

- Randomly selected 30 irrigation sub-sectors in Pisco;
- Invitations delivered to 50 cotton farmers in each sub-sector (hoping that 20 would show up);
- Sample size = 480 farmers (16/sub-sector);
- One session per day;
- Fieldwork: November - December, 2011.

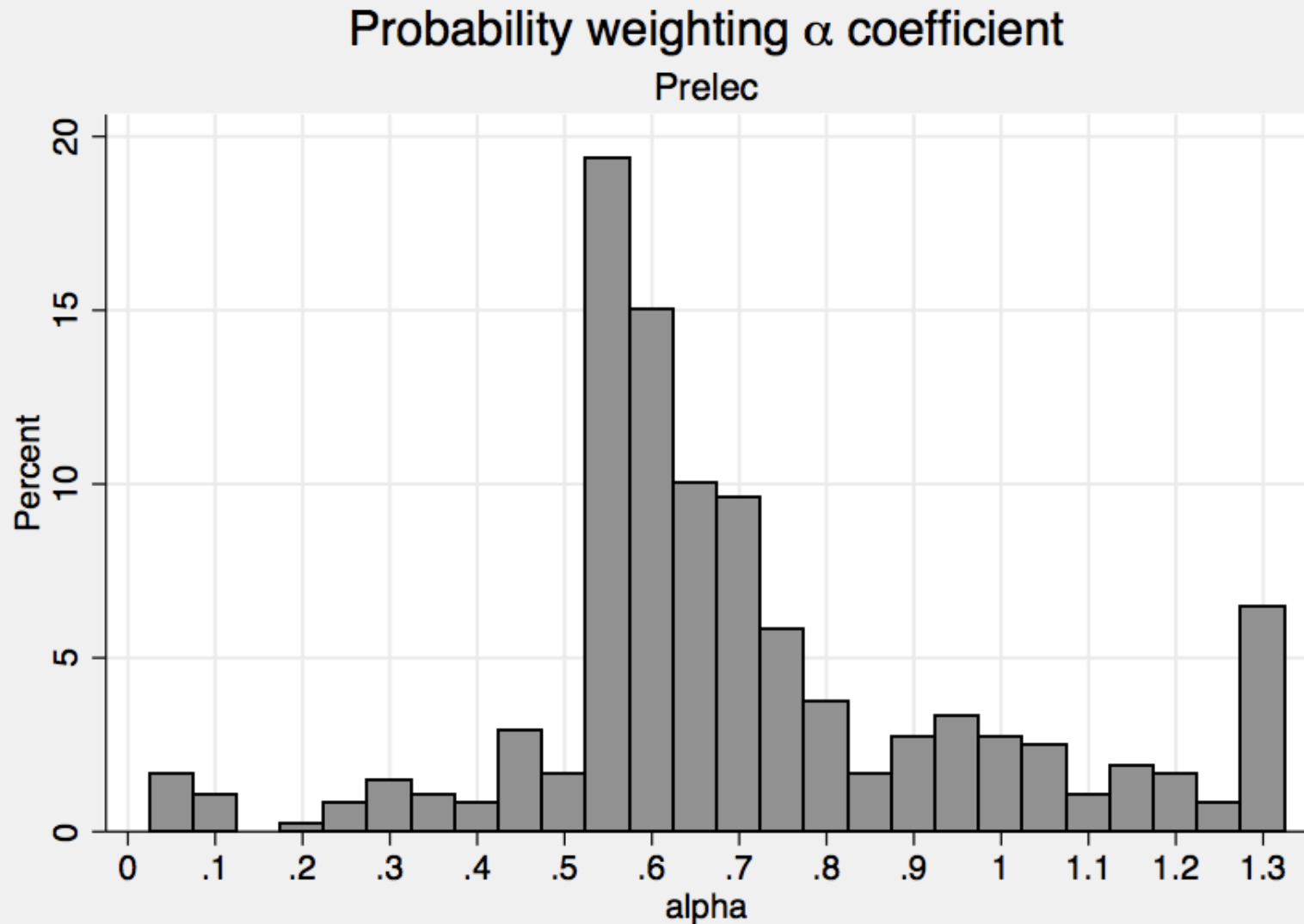
# Farmer Mean Characteristics

- Socio-economic
  - Age: 53 years
  - Male: 78%
  - Area operated: 5.3 ha.
  - Cotton experience: 8.5 years
  
- Preference Parameters
  - $\gamma$ : 0.56 (Risk Aversion)
  - $\alpha$ : 0.72 (Probability Weighting)
  - $\lambda$ : 2.90 (Loss Aversion)
  
- One session per day;
  
- Fieldwork: November - December, 2011.

# Marginal Distribution: Risk Aversion ( $\gamma$ )

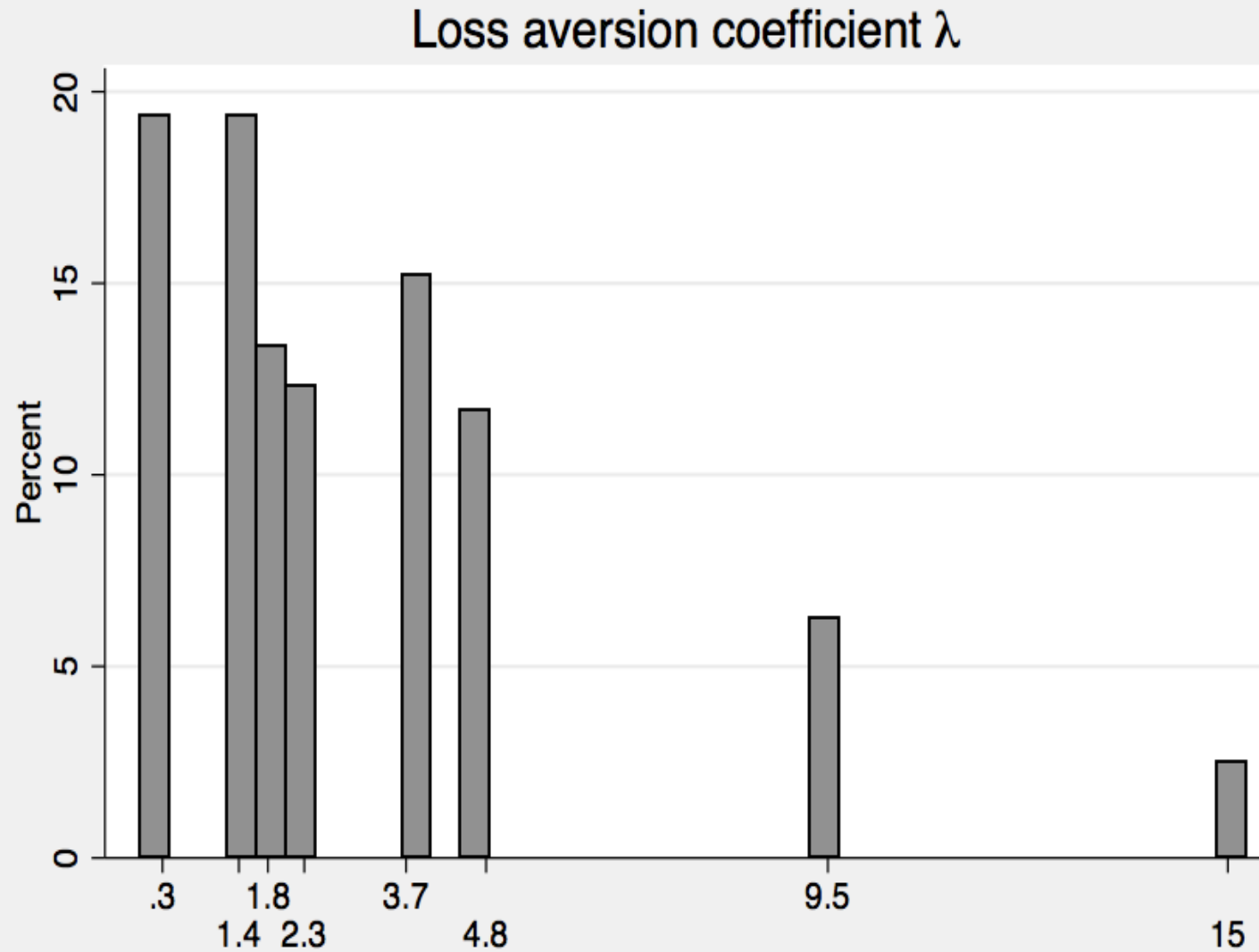


# Marginal Distribution: Probability Weighting





# Marginal Distribution: Loss Aversion



# Predictions Under Expected Utility Theory

(mean parameter values reported in each cell)

		Choice in GAINS game		
		No Insurance	Linear	Lump Sum
Choice in LOSSES game	No Insurance	N=118 $\gamma = 0.00$	N=0	N=0
	Linear	N=0	N=362 $\gamma = 0.58$	N=0
	Lump Sum	N=0	N=0	N=0

# Predictions Under Prospect Theory

(mean parameter values reported in each cell)

		Choice in GAINS game		
		None	Linear	Lump Sum
Choice in LOSS Game	None	N=25 $\gamma=-.006$ $\alpha=1.01$ $\lambda=.58$	N=10 $\gamma=.245$ $\alpha=.61$ $\lambda=.3$	N=0
	Linear	N=44 $\gamma=-.36$ $\alpha=.69$ $\lambda=2.15$	N=131 $\gamma=.30$ $\alpha=.54$ $\lambda=3.9$	N=0
	Lump Sum	N=118 $\gamma=.33$ $\alpha=1.22$ $\lambda=3.56$	N=221 $\gamma=.77$ $\alpha=.67$ $\lambda=2.8$	N=0

# Observed Choices

(mean parameter values reported in each cell)

		Choice in GAINS game			TOTAL
		None	Linear	Lump Sum	
Choice in LOSSES game	None	<b>N=82</b> $\gamma=.55$ $\alpha=.71$ $\lambda=2.3$	<b>N=19</b> $\gamma=.50$ $\alpha=.73$ $\lambda=2.1$	<b>N=18</b> $\gamma=.21$ $\alpha=.66$ $\lambda=2.4$	N=119
	Linear	<b>N=35</b> $\gamma=.54$ $\alpha=.63$ $\lambda=2.7$	<b>N=124</b> $\gamma=.43$ $\alpha=.70$ $\lambda=3.3$	<b>N=64</b> $\gamma=.41$ $\alpha=.70$ $\lambda=3.1$	N=223
	Lump Sum	<b>N=30</b> $\gamma=.48$ $\alpha=.70$ $\lambda=3.4$	<b>N=30</b> $\gamma=.38$ $\alpha=.79$ $\lambda=3.9$	<b>N=78</b> $\gamma=.37$ $\alpha=.74$ $\lambda=2.8$	N=138
	TOTAL	N=147	N=173	N=160	N=480

# Linear probability model for choice over gains

Dependent Variable = Buy any insurance?

VARIABLES	(4) ins1
crrac ( $\gamma$ )	0.184*** (3.512)
alpha	-0.0454 (-0.578)
Bad shock in ultimate trial round	-0.107 (-1.540)
Bad shock in penultimate trial round	-0.0129 (-0.206)
male	-0.0210 (-0.393)
Q9: age	-0.00239 (-1.148)
Q10: Education	-0.0273*** (-4.392)
Q17: Plots	-0.0778** (-2.176)
Q18: Area	0.00213 (0.622)
Q20: Years cotton	-0.00120 (-0.141)
Q22: Cotton av yield	-0.000465 (-0.257)
Constant	0.730*** (4.006)
Observations	471
R-squared	0.088

# What to make of this? Where to go next?

- First descriptive look not very satisfying
  - ▣ No clear “stories” to tell that would be consistent with EUT vs. CPT;
  - ▣ Risk Aversion result wrong direction
  
- Relative predictive power?
  - ▣ EUT:
    - In Gains Game: 32% predicted correctly
    - In Losses Game: 40% predicted correctly
    - 12% of joint outcomes predicted correctly
  - ▣ CPT:
    - In Gains Game: 31% predicted correctly
    - In Losses Game: 35% predicted correctly
    - 14% of joint outcome predicted correctly

# What to make of this? Where to go next?

## □ Caveats

- Are farmers bringing in alternative framings or “Reference Points”?
  - Example: I consider any yield  $< 60$  qq/ha a “loss”
- Risk Aversion result wrong direction:
  - Is insurance more like “technology adoption”?

## □ Next steps

- Explore alternative functional forms;
- Basic multi-nomial regressions;

## □ Other suggestions?