

# Dynamic Inconsistencies: A Revealed Preference Approach

Syngjoo Choi  
(SNU and UCL)

Shachar Kariv  
(UC Berkeley)

Wieland Müller  
(Tilburg and Vienna)

Dan Silverman  
(ASU)

2016 ASSA Conference

# Three Questions on Intertemporal Choice

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## 1. Consistency

- Is behavior consistent with a model of utility maximization?

## 2. Structure of preferences

- What are the structural properties of the underlying utility function?

## 3. Parsimony

- Is a simple rational model well-specified for observed choices?

## In This Talk

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- Revealed preference analysis for (in-)consistency of intertemporal choices
- A novel experimental design allowing us to explore this at the individual level
- Nonparametric analysis of both **consistency with utility maximization** and **time consistency** (or more precisely, **stationarity**)

# Decision in the Experiment

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- Subjects choose any non-negative allocation  $x = (\textcolor{red}{x}_t, \textcolor{blue}{x}_{t+k})$  such that

$$\textcolor{red}{x}_t + \frac{\textcolor{blue}{x}_{t+k}}{1+r} = m$$

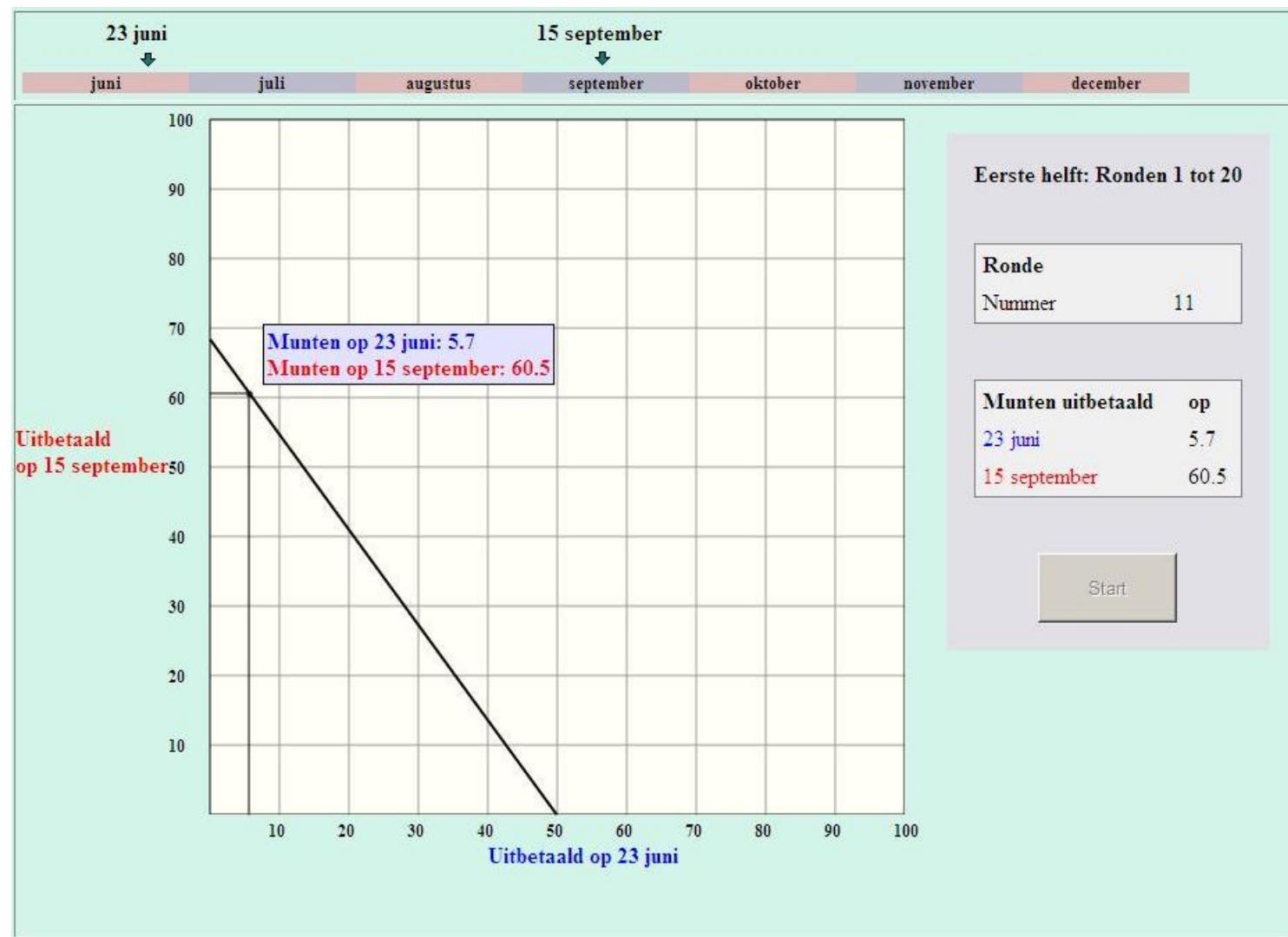
- Subjects make choices in a wide range of budget lines w.r.t.  $r$  and  $m$ .
- Each subject faces two time frames – **near** and **distant** – by varying the sooner payment date,  $t < t'$ . Time horizon  $k$  are held constant.
- The same set of budget lines are presented in the two frames (randomly ordered).

# Further Detail of the Experiment

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- Environments
  - 1,425 subjects from the CentERpanel
  - 211 subjects from Xlab at UC Berkeley
- Dates and horizon
  - At the Xlab,  $t$  (tomorrow),  $k$  (28 days),  $t'$  (a month later)
  - At the CentERpanel,  $t$  (a week later),  $k$  (12 weeks),  $t'$  (13 weeks later)
- Number of choices in a time frame
  - 20 choices at the CentERpanel and 50 choices at the Xlab
- At the end of the experiment, one decision problem was randomly chosen for payment.

# Sample Screen



# Revealed Preferences within Time Frame

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- Let  $\{(p^i, x^i)\}$ , for  $i = 1, \dots, N$ , denote observed individual data within time frame.
- **Generalized Axiom of Revealed Preferences (GARP)**

$$\left. \begin{array}{l} p^1 \cdot x^1 \geq p^1 \cdot x^2 \\ p^2 \cdot x^2 \geq p^2 \cdot x^3 \\ \vdots \\ p^{n-1} \cdot x^{n-1} \geq p^{n-1} \cdot x^n \end{array} \right\} \Rightarrow p^n \cdot x^n \leq p^n \cdot x^1$$

- **Afriat's Theorem** *If the data satisfies GARP, then there exists a utility function that rationalizes the observed choices.*
- GARP offers an exact test: either the data satisfy GARP or not.

# Quantifying GARP violations: CCEI

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- **Afriat's critical cost efficiency index (CCEI)** *The amount by which each budget constraint must be relaxed in order to remove all violations of GARP.*
- CCEI is the largest number  $e \in [0, 1]$  such that

$$\left. \begin{array}{l} e(p^1 \cdot x^1) \geq p^1 \cdot x^2 \\ e(p^2 \cdot x^2) \geq p^2 \cdot x^3 \\ \dots \\ e(p^{n-1} \cdot x^{n-1}) \geq p^{n-1} \cdot x^n \end{array} \right\} \Rightarrow e(p^n \cdot x^n) \leq p^n \cdot x^1$$

- CCEI measures the extent of GARP violations in terms of monetary costs.

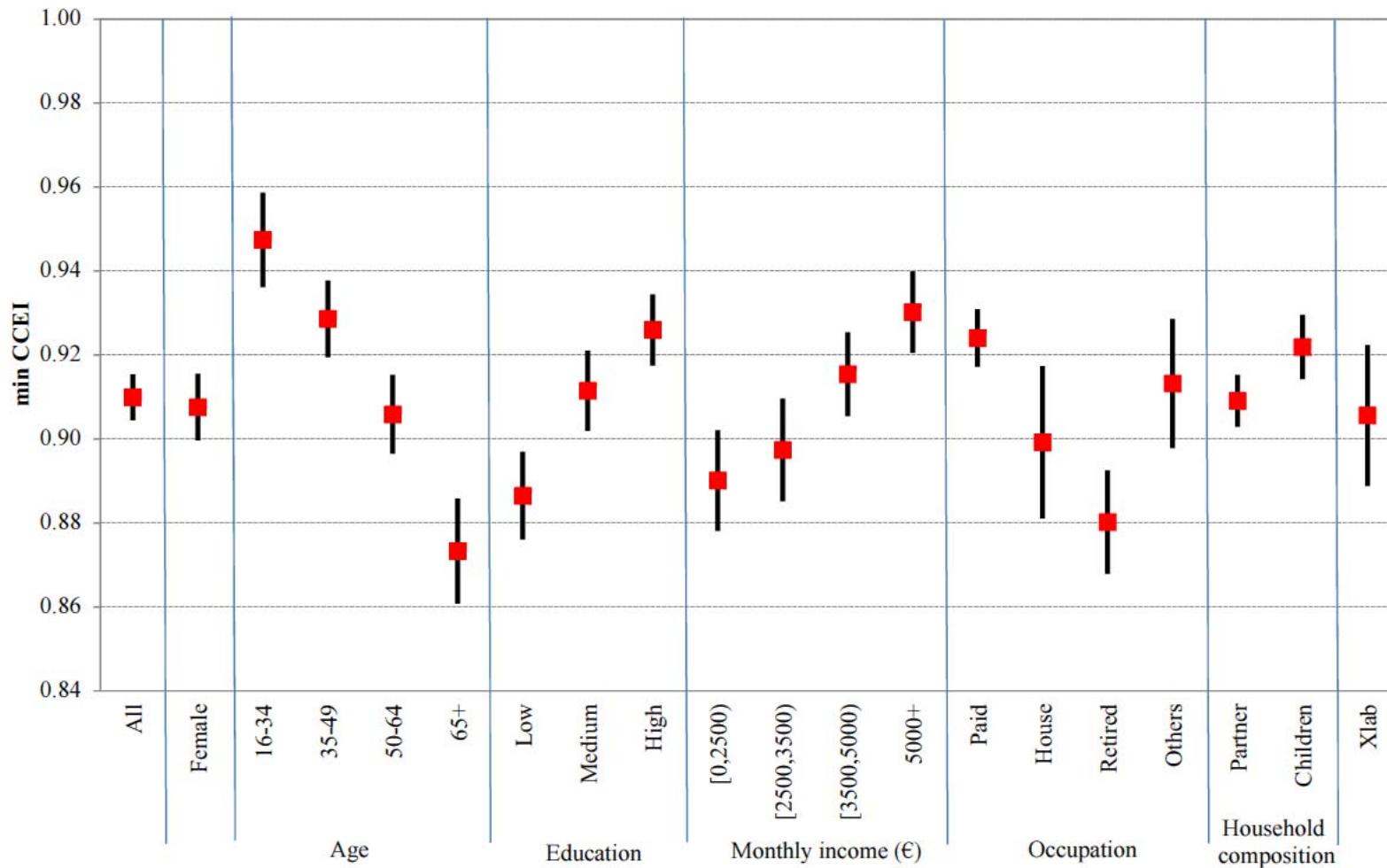
## Consistency within Time Frame

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- We use the minimum of CCEIs of the near and distant time frames as an overall summary of consistency with utility maximization (within time frame).
- **Who is more rational?** We correlate heterogeneity in CCEI and sociodemographic information of subjects in the CentERpanel experiment.
- Findings in the domain of intertemporal decision making corroborate those in an earlier work in the domain of decision making under uncertainty, Choi et al. (2014).

# Minimum of CCEI Scores of Two Time Frames (sample means and 95% CIs)

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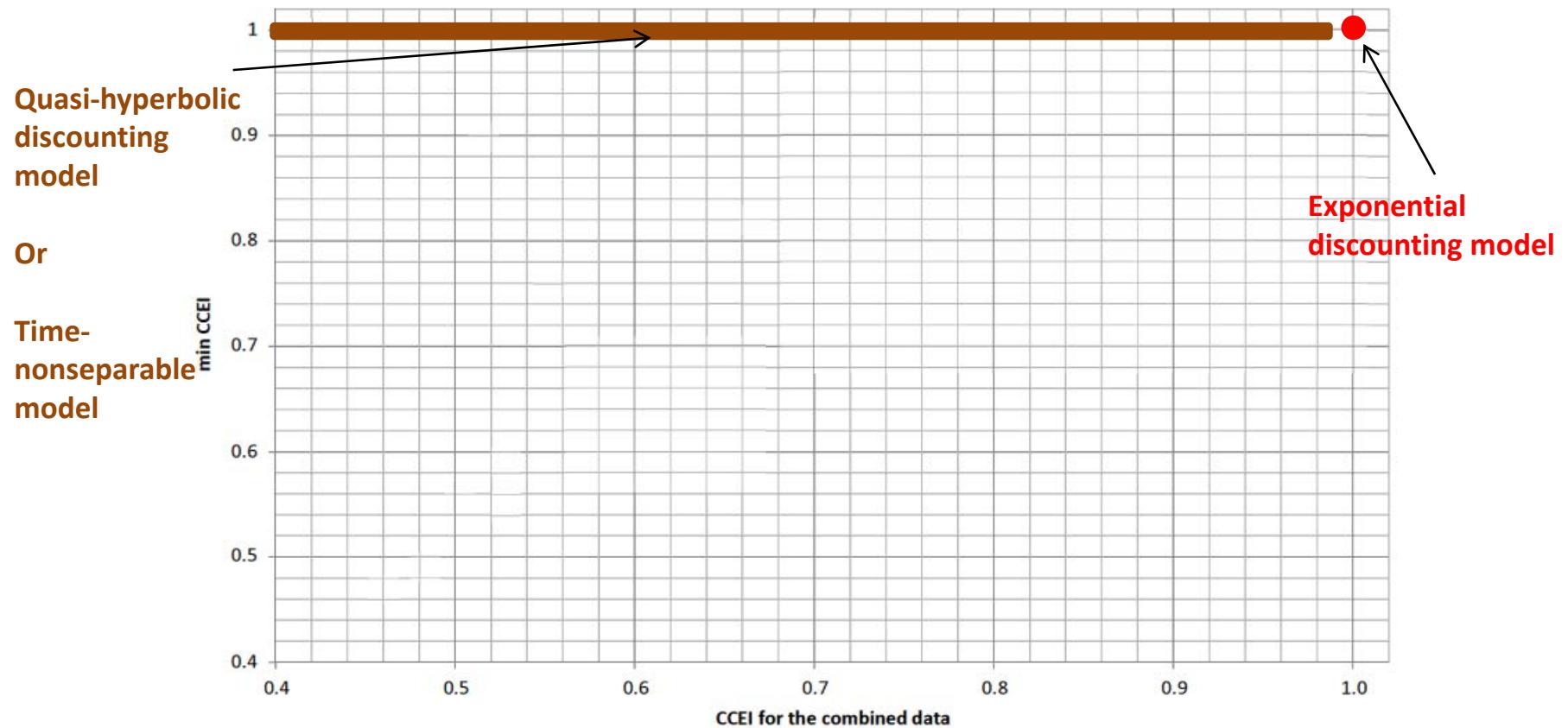
# A GARP Test of Stationarity

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- In order to examine patterns of **consistency between time frames**, we first compute the CCEI of the combined data of the two time frames.
- We relate this with the minimum of CCEIs of the near and distant time frames.
- By definition, the CCEI of the combined data cannot be higher than the minimum of CCEIs.
- Different models of time preferences predict different relationships between these two variables.

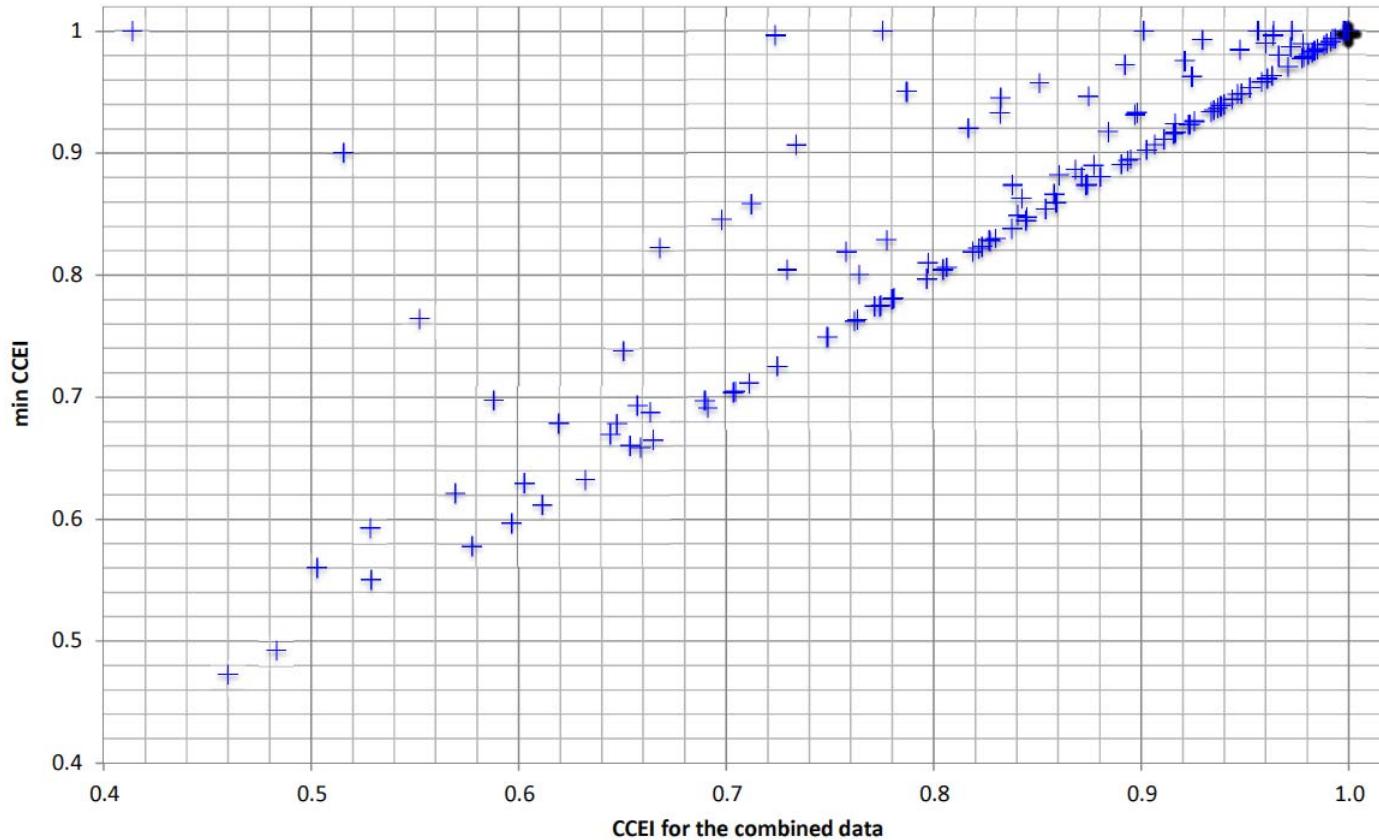
# Predicted Relation between min CCEI and CCEI of the combined data

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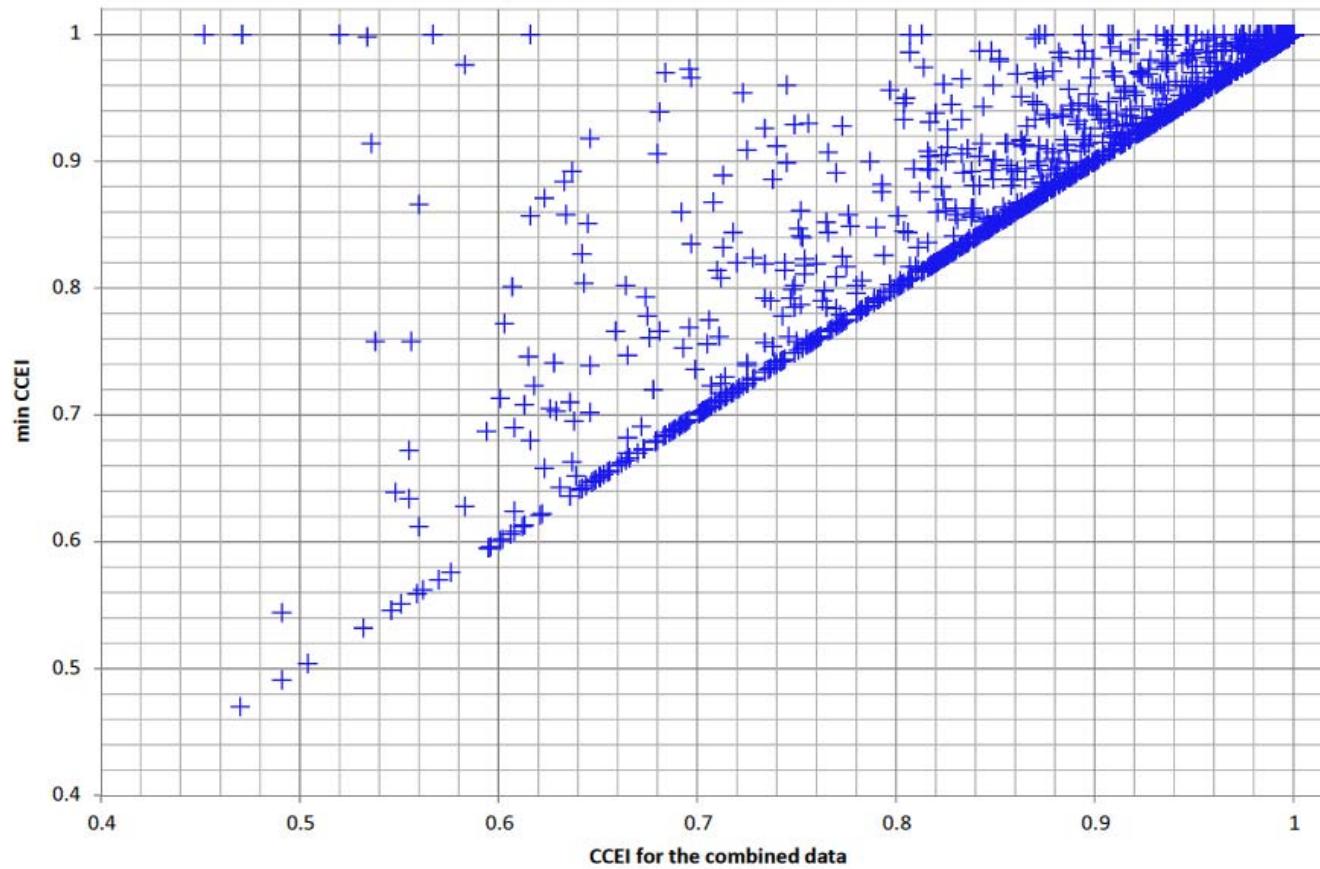
# Relation between min CCEI and CCEI of the combined data: Xlab data

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- 52% of subjects:  $(\text{CCEI for the combined data}) \leq 0.95$
- 62% of them:  $(\text{CCEI for the combined data}) = (\text{min CCEIs})$
- Only around 6% of them:  $(\text{min CCEIs}) \approx 1$

# Relation between min CCEI and CCEI of the combined data: CentERpanel data



- 57% of subjects:  $(\text{CCEI for the combined data}) \leq 0.95$
- 64% of them:  $(\text{CCEI for the combined data}) = (\text{min CCEIs})$
- Only around 5% of them:  $\text{min CCEIs} \approx 1$

# A Statistical (Permutation) Test of Stationarity

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- To obtain a distribution for the test statistic under the null hypothesis of stationarity,
  - 1) Rearrange (permute) the choice data by randomly reassigning the choices from the two time frames for each budget line;
  - 2) Compute the consistency score for each permutation and construct the joint probability distribution of the min and max scores;
  - 3) Compare the actual min and max scores with their permutation distribution.

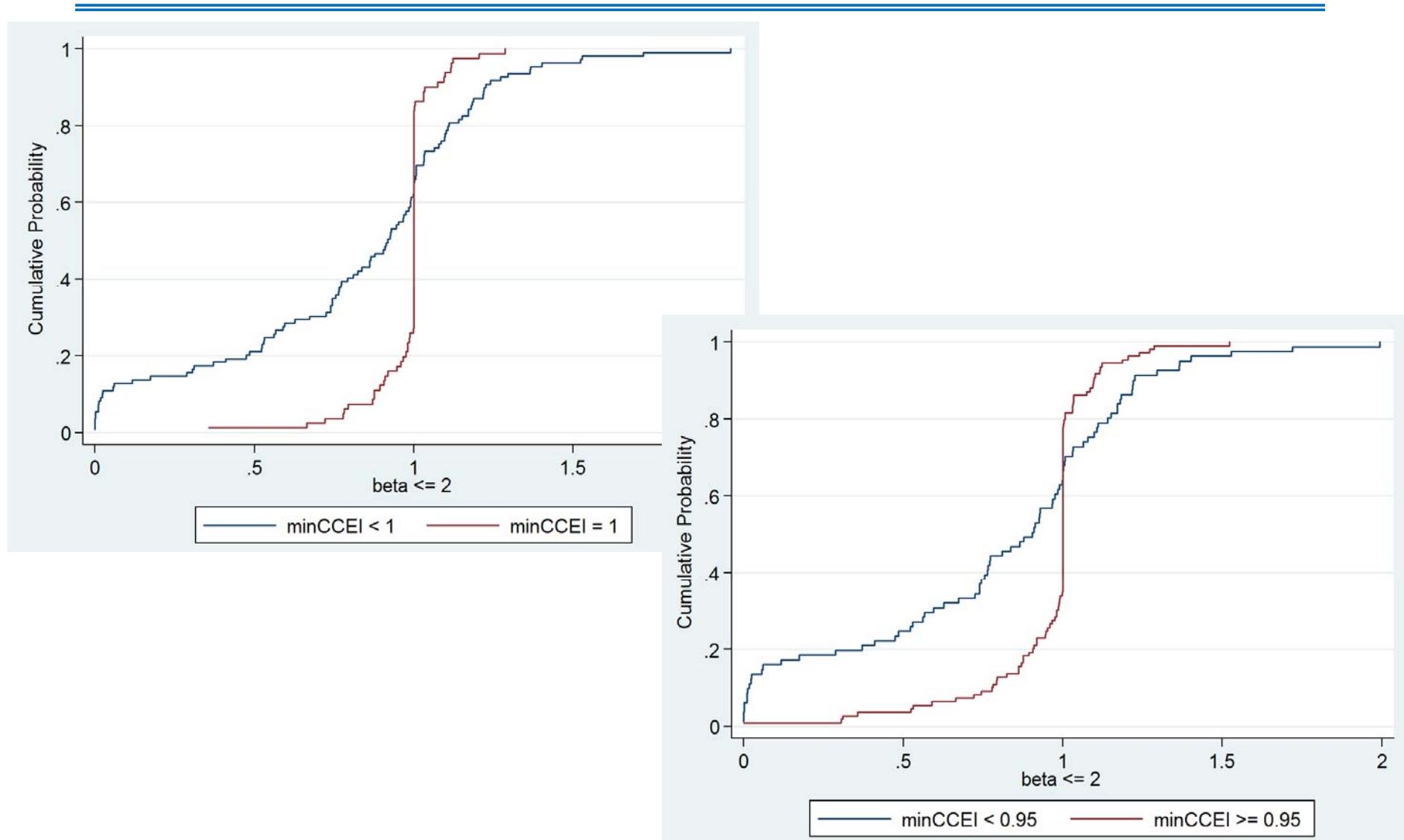
# Relation b/w Permutation Test and $(\beta, \delta)$ Model

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- Compare the permutation test with standard  $(\beta, \delta)$  model (with power utility function).

	Permutation test	
	Stationary	Nonstationary
$\hat{\beta} < 1$ (50)	54% (27)	46% (23)
$\hat{\beta} = 1$ (131)	84% (110)	16% (21)
$\hat{\beta} > 1$ (30)	67% (20)	33% (10)
Total (211)	74% (157)	26% (54)

# Relation b/w minCCEI and $(\beta, \delta)$ Model



# Summary

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- There is a high level of heterogeneity in (within-frame) consistency, which is strongly correlated with socioeconomic information.
- A GARP test of stationarity is largely driven by inconsistency within frame.
- The estimation of standard  $(\beta, \delta)$  model tends to reject stationarity too frequently due to inconsistency.