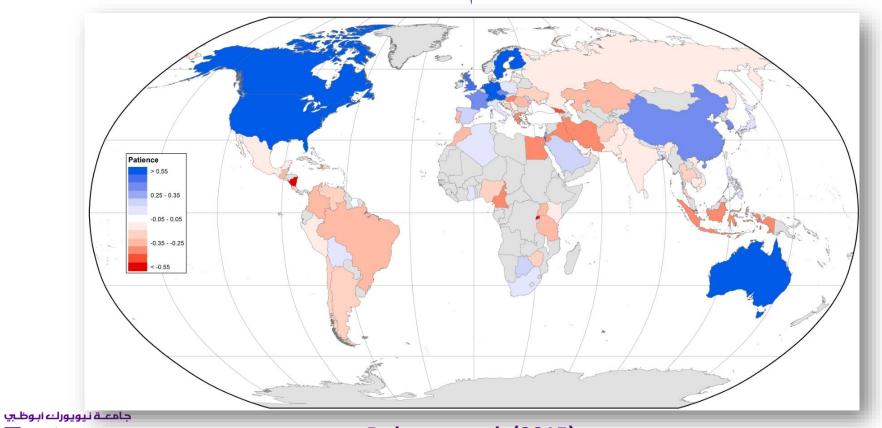


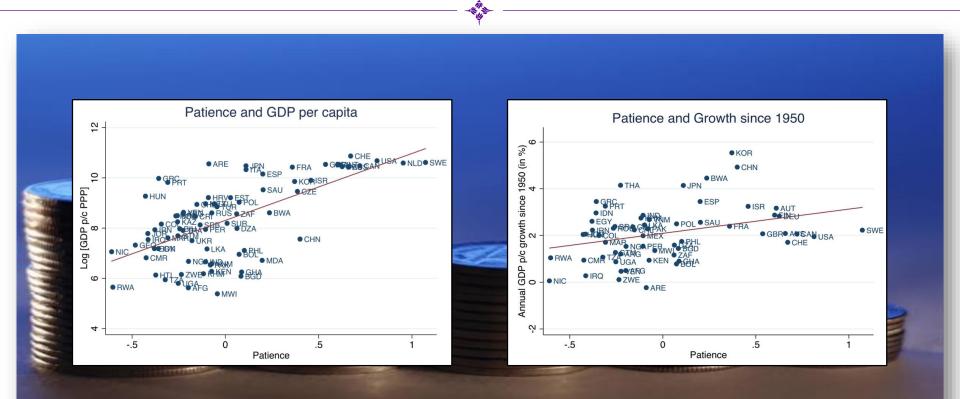
# EXPERIMENTAL ECONOMICS INTERTEMPORAL DECISION-MAKING

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	Table 2: Patience and national income in sub-samples								
		Dependent variable: Log [GDP p/c PPP] in							
	Africa & Middle East (1)	Europe & C. Asia (2)	SE Asia & Pacific (3)	Ameri- cas (4)	$\begin{array}{c} \operatorname{OECD} \\ (5) \end{array}$	Non- OECD (6)	Colo- nized (7)	Not colonized (8)	
Patience	$2.83^{***}$ (0.76)	$1.82^{***} \\ (0.33)$	$3.76^{***}$ (1.04)	$2.42^{***}$ (0.32)	$1.02^{***}$ (0.21)	$1.43^{**}$ (0.65)	$2.54^{***}$ (0.36)	$2.23^{***}$ (0.51)	
Constant	$7.84^{***} \\ (0.34)$	$9.09^{***}$ (0.19)	$7.40^{***}$ (0.33)	$8.55^{***}$ (0.20)	$9.75^{***}$ $(0.15)$	$7.77^{***}$ $(0.20)$	$8.10^{***}$ (0.16)	$8.87^{***}$ (0.30)	
Observations $R^2$ Adjusted $R^2$	$20 \\ 0.274 \\ 0.234$	$27 \\ 0.448 \\ 0.426$	$14 \\ 0.430 \\ 0.383$	$15 \\ 0.592 \\ 0.560$	$22 \\ 0.498 \\ 0.473$	$54 \\ 0.073 \\ 0.055$	$54 \\ 0.313 \\ 0.300$	$22 \\ 0.434 \\ 0.406$	

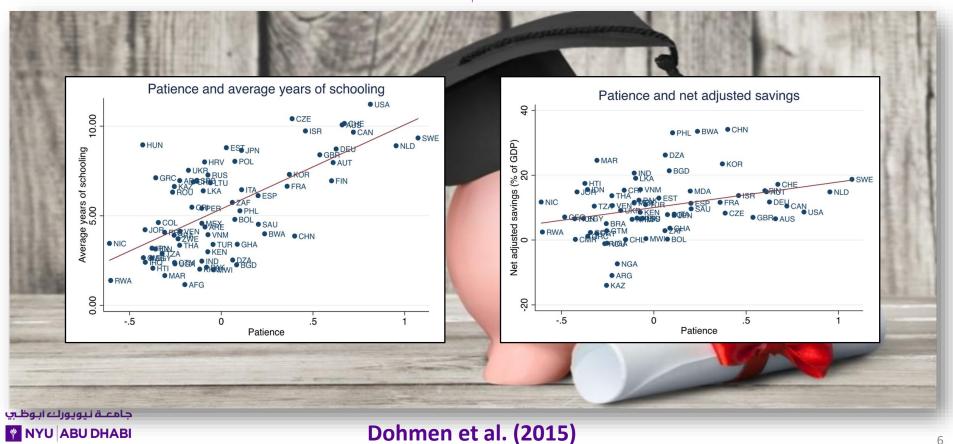
OLS estimates, robust standard errors in parentheses. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01. In the first column, the sample includes Africa and the Middle East, in the second column Europe and Central Asia, in the third South-East Asia and Pacific, in the fourth the Americas, in the fifth (sixth) all (non-) OECD members, and the seventh (eigth) all formerly colonized (never colonized) countries.

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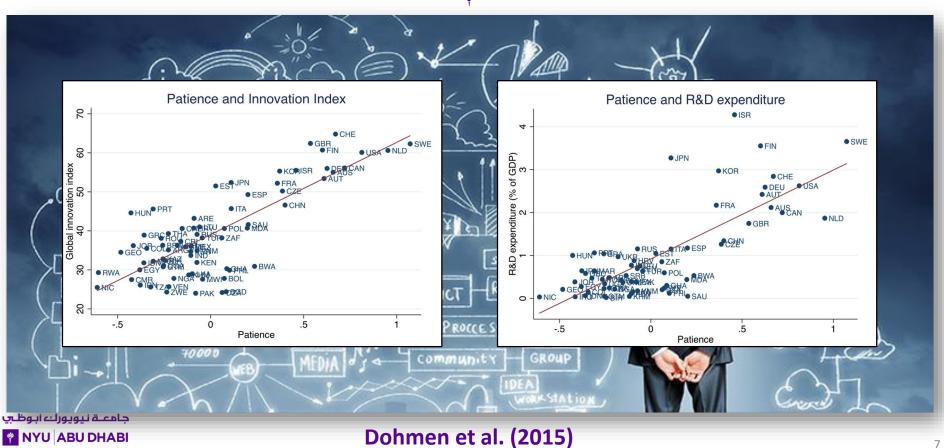
			Dependent			
	$\log [GDP]$	per worker PPP]	Human D $\epsilon$	evelopment Index	Subjectiv	ve happines:
	(1)	(2)	(3)	(4)	(5)	(6)
Patience	$1.59^{***}$ (0.21)	$0.66^{***}$ (0.24)	$0.23^{***}$ (0.03)	$0.13^{***}$ (0.03)	$0.13^{***}$ (0.03)	$0.21^{***}$ (0.04)
Constant	$9.84^{***}$ (0.11)	$-61.2^{*}$ (30.63)	$0.70^{***}$ (0.01)	$-11.5^{**}$ (5.05)	$0.72^{***}$ (0.01)	$-11.4^{**}$ (5.47)
Additional controls	No	Yes	No	Yes	No	Yes
Observations $R^2$ Adjusted $R^2$	$71 \\ 0.309 \\ 0.299$	$69 \\ 0.896 \\ 0.849$	76 0.335 0.326	74 0.881 0.833	$76 \\ 0.140 \\ 0.129$	$74 \\ 0.741 \\ 0.637$

column (7) of Table 1 for a complete list of the additional controls.





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	Dependent variable: Log [GDP p/c PPP]						
	(1)	(2)	(3)	(4)	(5)		
Patience	$2.66^{***}$ (0.26)	$0.82^{***}$ (0.31)	$0.58^{***}$ (0.18)	$1.07^{***}$ (0.40)			
Average years of schooling		$0.40^{***}$ (0.05)					
Log [Capital stock $p/c$ ]			$1.00^{***}$ (0.07)				
Total factor productivity				$3.71^{***}$ (0.66)			
Property rights					$0.037^{**}$ (0.01)		
Democracy					$0.053 \\ (0.05)$		
Constant	$8.31^{***}$ (0.14)	$6.20^{***}$ (0.32)	$-1.68^{**}$ (0.68)	$6.29^{***}$ (0.36)	$6.18^{***}$ (0.34)		
Observations	76	71	71	60	72		
$R^2$	0.397	0.662	0.908	0.750	0.602		
Adjusted $R^2$	0.389	0.652	0.905	0.741	0.584		



#### The marshmallow test (Mischel et al. 1989)

Eat one marshmallow or wait and get two!

Delay	Exposed	Covered
No suggestion	6m 5s	9m 50s
Suggestion	8m 37s	9m 45s



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#### The marshmallow test (Mischel et al. 1989)

A decade later, correlation with SAT scores

Correlation	Exposed	Covered	
No suggestion	Verbal: 0.42 <sup>*</sup> Math: 0.57 <sup>**</sup>	Verbal: –0.12 Math: –0.31	
Suggestion	Verbal: –0.40 Math: –0.26	Verbal: –0.21 Math: –0.23	

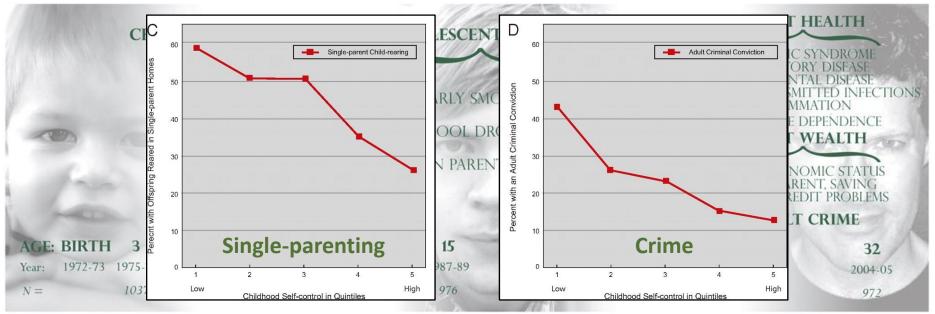


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Dunedin multidisciplinary health and development study (Moffitt et al. 2011)

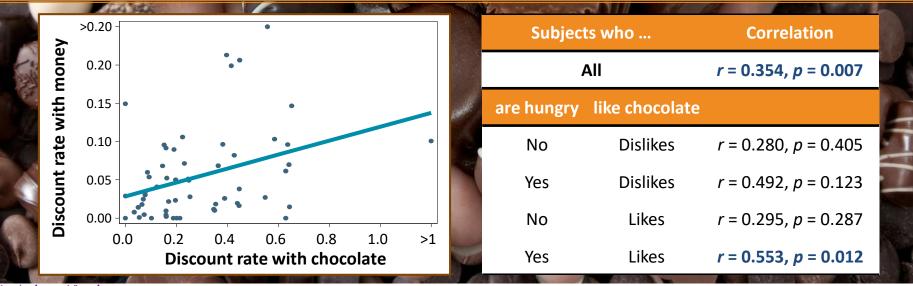
Self-control measured with reports by the subjects, teachers, and parents



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#### Discounting for primary and monetary rewards (Reuben et al. 2010)

Choose between x now and (1+r)x in one week when x equals \$50 and when it equals 5 large chocolates



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Table 11: Individual patience, human capital, and income										
		Dependent variable:								
	Le	og [House]	nold incom	ie p/c]	Education level					
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)		
Patience	$0.35^{***}$ (0.05)	$0.053^{***}$ (0.01)	$0.046^{***}$ (0.01)	$0.047^{***}$ (0.01)	$0.20^{***}$ (0.03)	$\begin{array}{c} 0.13^{***} \\ (0.01) \end{array}$	$0.14^{***}$ (0.01)	$0.097^{***}$ (0.01)		
Age				$\begin{array}{c} 0.0052^{***} \\ (0.00) \end{array}$				$0.020^{***}$ (0.01)		
Age squared				$-0.000037^{*}$ (0.00)				-0.00040*** (0.00)		
1 if female				-0.094*** (0.02)				$-0.13^{***}$ (0.03)		
Constant	$7.88^{***}$ (0.13)	$6.35^{***}$ (0.00)	$5.93^{***}$ (0.00)	$5.87^{***}$ (0.03)	$1.00^{***}$ (0.05)	$2.27^{***}$ (0.04)	$3.06^{***}$ (0.05)	$3.30^{***}$ (0.14)		
Country FE	No	Yes	No	No	No	Yes	No	No		
Regional FE	No	No	Yes	Yes	No	No	Yes	Yes		
$\begin{array}{c} \text{Observations} \\ R^2 \\ \text{Adjusted} \ R^2 \end{array}$	79267 0.053 0.053	79267 0.601 0.601	79239 0.634 0.629	$78984 \\ 0.636 \\ 0.631$	$79357 \\ 0.015$	$79357 \\ 0.116$	$79334 \\ 0.149$	$79125 \\ 0.176$		

Columns (1)-(4) contain OLS and columns (5)-(8) ordered probit estimates. Standard errors (clustered at country level) in parentheses. The dependent variable in (5)-(8) is educational attainment as a three-step category. Here, the  $R^2$  is a Pseudo- $R^2$ . \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01



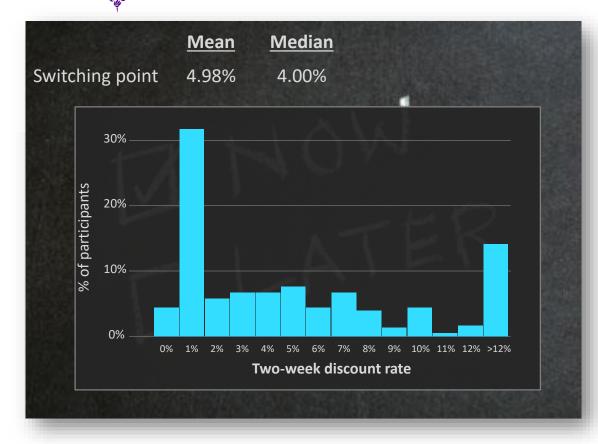
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## How to elicit discount factors?

#### Reuben et al. (2015)

 Asked 544 MBAs to choose the timing of a payment

\$100 today or \$100 in two weeks \$100 today or \$101 in two weeks \$100 today or \$102 in two weeks \$100 today or \$103 in two weeks \$100 today or \$104 in two weeks \$100 today or \$105 in two weeks \$100 today or \$106 in two weeks \$100 today or \$107 in two weeks \$100 today or \$108 in two weeks \$100 today or \$109 in two weeks \$100 today or \$110 in two weeks \$100 today or \$111 in two weeks \$100 today or \$112 in two weeks جامعية نيوبورك أيوظني

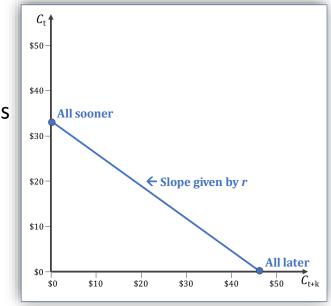


### HOW TO ELICIT DISCOUNT FACTORS?

- Problem of single multiple-price lists  $\rightarrow$  ignores the concavity of utility functions
- Andersen et al. (2008)

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- Multiple price lists: elicit the curvature of utility functions (e.g., Holt & Laury 2002) and discount factors separately
- Andreoni & Sprenger (2012)
  - Convex time budgets: measure curvature of utility functions and discount factors with a single set of choices
- Higher discount factors once concavity of the utility function is taken into account
  - but convex time budgets can show high degree of GARP violations (Chakraborty et al. 2017) that correlate with parameter estimates (Choi et al. 2015)



## IS IT A MEASUREMENT PROBLEM?

#### "Money now vs. later" has many confounds (Chabris et al. 2008)

- Unreliability of future rewards (trust in the experimenter)
- Transaction costs of delayed reward
- Framing effects (response scale)
- Timing of consumption (liquidity constraints)
- Discount factors elicited with visceral goods tend to be even lower!
  - Receiving monetary rewards is also intrinsically satisfying (Kable & Glimcher 2007)



### SHORT-TERM DISCOUNT FACTORS

- What are we eliciting with short time-horizons?
  - Which option would you prefer?  $u(\$15) > \delta u(\$20) \rightarrow \delta^{month} \le 0.75$
  - What about the following choices?  $u(\$15) > \delta^{6-months}u(\$84)$   $u(\$15) > \delta^{1-year}u(\$470)$   $u(\$15) > \delta^{2-year}u(\$14,900)$  $u(\$15) > \delta^{5-year}u(\$470,000,000)$



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### PRESENT-BIASED PREFERENCES

#### Quasi-hyperbolic discounting (Laibson 1994; O'Donoghue & Rabin 2001)

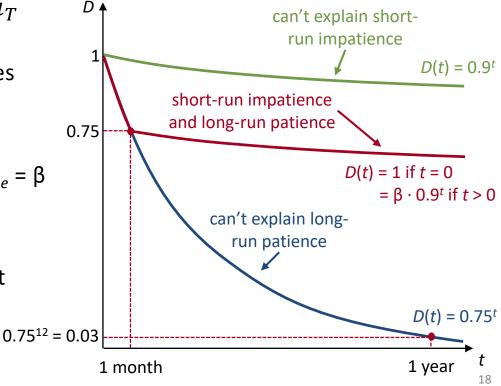
$$U_0 = u_0 + \beta \delta u_1 + \beta \delta^2 u_2 + \dots + \beta \delta^T u_T$$

- If β < 1 then impatience for choices that involve the present but patient for choices that involve only the future
- Exponentials: β = 1

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- Sophisticated: β < 1 and at t = 0 expect β<sub>e</sub> = β
- Naïve:  $\beta < 1$  and at t = 0 expect  $\beta_e = 1$
- Predicts preference reversals over time, procrastination, demand for commitment

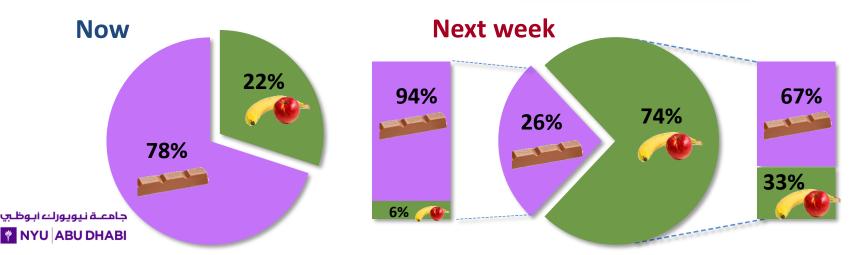


### TIME INCONSISTENCY IN SNACKING?

#### Read & van Leeuwen (1998)

Asked 200 employees what snack they would you like to eat now or in one week

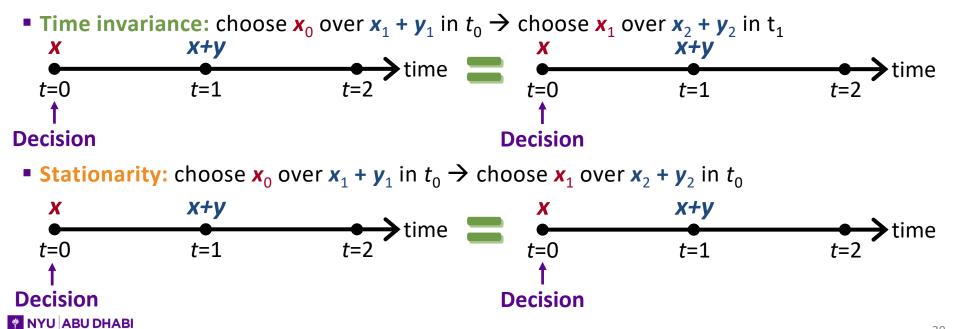




### TIME CONSISTENCY, STATIONARITY, AND TIME INVARIANCE

#### Halevy (2015)

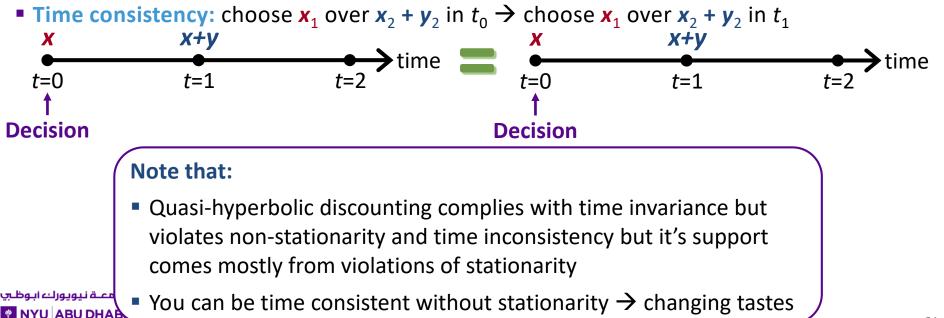
I17 subjects make large-stake and small-stake choices between an early reward \$x and a delayed reward of \$(x + y) to test violations of three concepts



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### TIME CONSISTENCY, STATIONARITY, AND TIME INVARIANCE

Time invariant	Stationary	Time consistent	Large	Small
Yes	Yes	Yes	39%	43%
Yes	No	No	15%	8%
No	Yes	No	17%	21%
No	No	Yes	15%	22%
No	No	No	14%	6%

Halevy (2015)

- Largest fraction are exponentials ≈ 40%
- Only a small fraction are "true" quasi-hyperbolics < 15%</li>
- If one uses violations of stationarity as evidence of quasi-hyperbolics then one misclassify them as being three times more common

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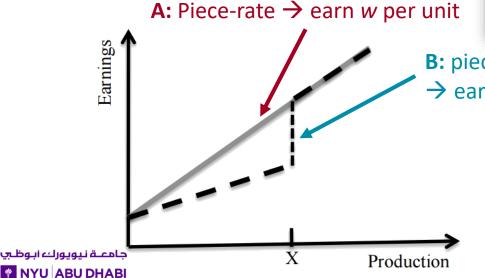
## Self-commitment to avoid temptation is an old idea



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#### Kaur et al. (2015)

- Suppose you are hired for a boring job that pays you at the end of each week
- Two available contracts:



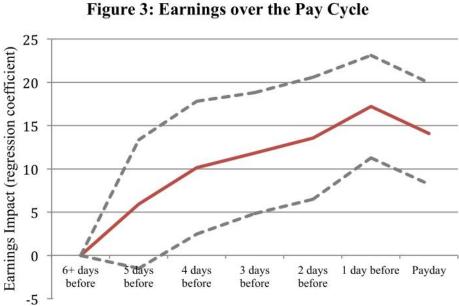


**B:** piece-rate + penalty  $\rightarrow$  earn w per if  $Q \ge X$ , else earn ½w per unit

> You never earn more under B and you may earn much less! Why would you choose B instead of A?

#### Kaur et al. (2015)

- Pay-day effects and present-biased workers
  - Some workers work harder as paydays approach
  - Would they like to commit to work harder at the beginning of the week?



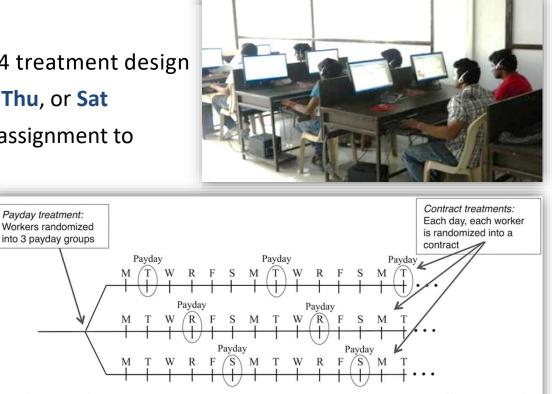


Training

#### Kaur et al. (2015)

- 102 works over 8 months in a 3×4 treatment design
  - Payday (between-subjects): Tue, Thu, or Sat
  - Contract (within-subjects): daily assignment to
    - Piece-rate
    - Piece-rate + penalty with imposed target
    - Piece-rate + penalty with chosen target that day
    - Piece-rate + penalty with chosen target the day before

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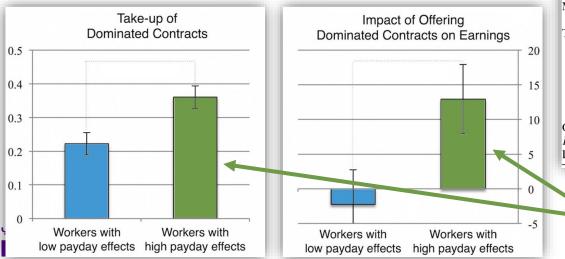


Experiment (8 months)

Endline

#### Kaur et al. (2015): Results of the piece-rate + penalty contract

- Chosen 28% of the time
- Increases production without reducing quality if target is imposed or chosen the day before
- Increases earnings if target is chosen the day before



Contract Treatments: Treatment Effects of Contracts						
	Dependent Variable					
	Production	Earnings				
Option to choose dominated contract						
Evening option to choose dominated contract	$(69)^{**}$	4.60 (2.17)**				
Morning option to choose dominated contract		(2.17) 2.32 (2.17)				
Target imposed:		× /				
Level 1 target	3	-1.55				
Level 2 target	$(90) \\ 213 \\ (91)**$	(2.88) 3.13 (2.89)				
Level 3 target	334	5.01				
	(150)**	(4.80)				
Observations: worker-days	8,423	8,423				
$R^2$	.59	.57				
Dependent variable mean	5,337	172				

# Effects are driven by workers with self-control problems

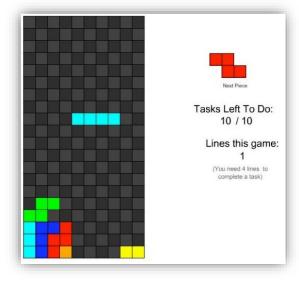
#### Augenblick et al. (2015)

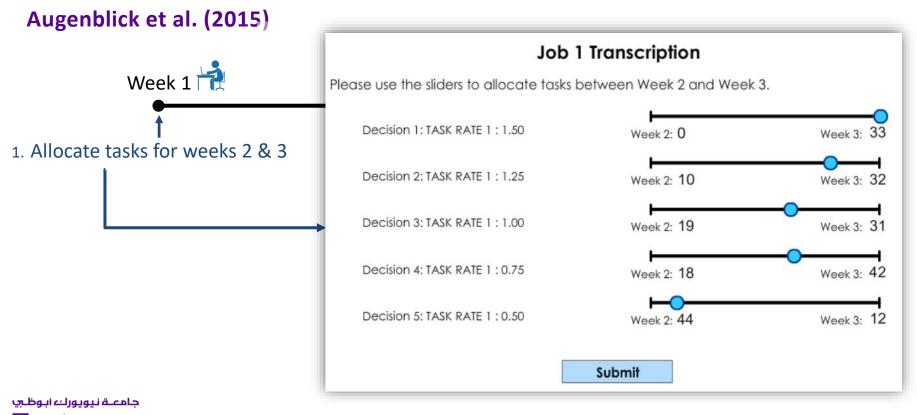
102 subjects decide allocations of effort for two (boring) jobs over seven weeks

#### Job 1: Greek transcription

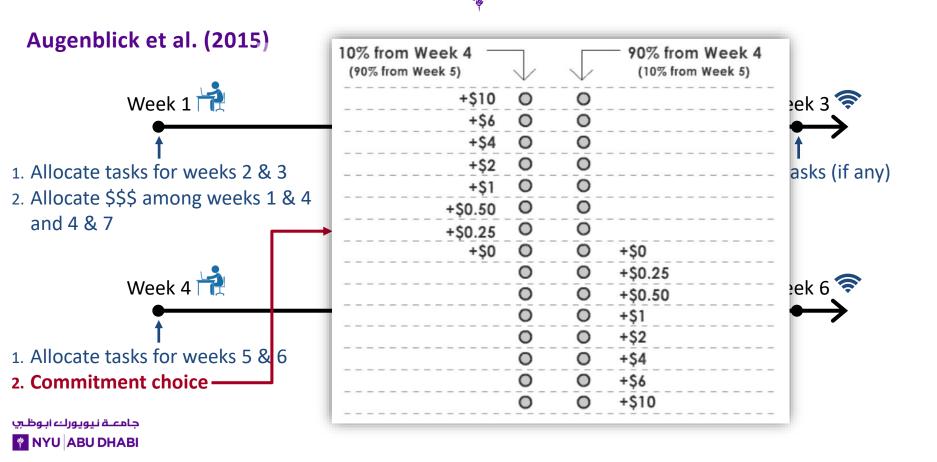
		20% Completed	(2 out of 10).						
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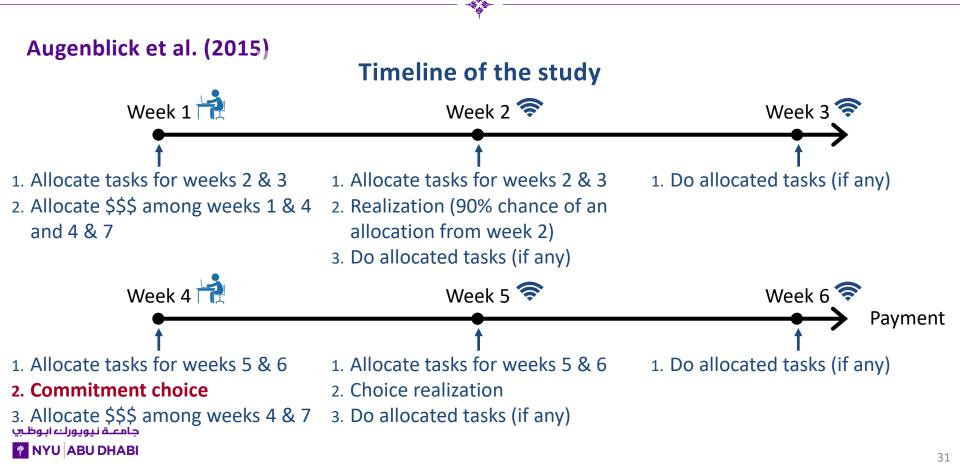
#### Job 2: Partial Tetris





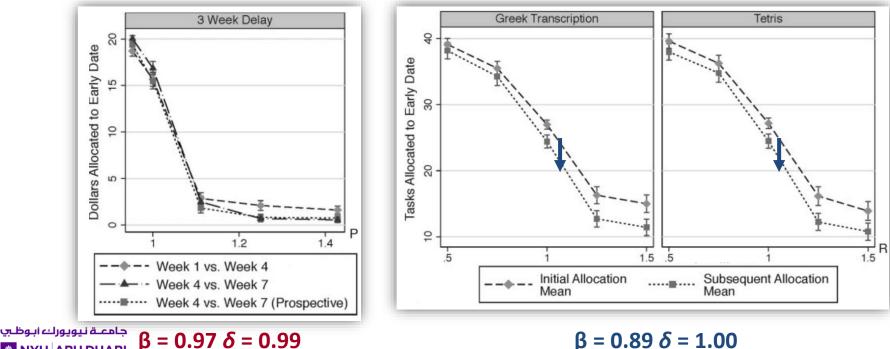
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#### Augenblick et al. (2015)

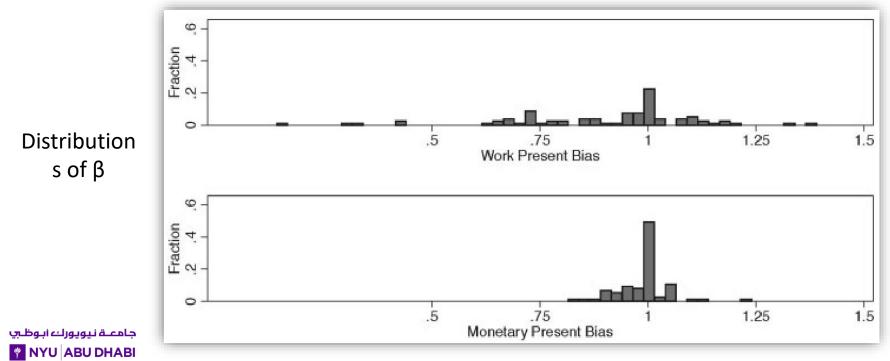
#### Evidence of present-bias with effort but not with money



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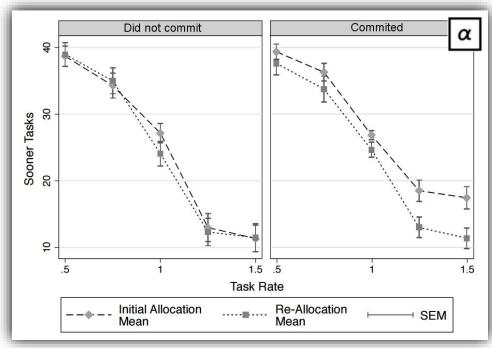
#### Augenblick et al. (2015)

#### Evidence of present-bias with effort but not with money



#### Augenblick et al. (2015)

- 59% choose commitment when it is free
  - Chosen by those with more present bias
- But no willingness to pay for commitment or flexibility
  - Median willingness to pay is only \$0.125 for commitment
  - 91 percent prefer flexibility when the price of commitment is \$0.25
  - 90 percent prefer commitment when the price of flexibility is \$0.25





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