Household Water and Energy Use: An Experimental Analysis of Decision-making under Uncertainty and Penalty Rate Structures

Liesel Hans¹ Dr. Christopher Goemans and Dr. Stephan Kroll²

¹Department of Economics Colorado State University Fort Collins, CO ²Dept. of Ag. and Resource Economics Colorado State University Fort Collins, CO

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Contact ⊳ Liesel.Hans@Colostate.edu



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Bill Shock

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Liesel Hans



Bill Shock

 "It can be difficult to know when you're running up a surprising high wireless bill, especially if you don't monitor your usage or receive automatic usage alerts" – fcc.gov

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Water and Energy

Utilities are anticipating gaps between supply and demand

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"For the United States to realize its full demand response potential, customers must have access to, and a better understanding of, information about real-time or near-real-time price"

- Energy Independence and Security Act of 2007

OUTLINE

- 1 Background
- 2 Experimental Design
- 3 Results
- 4 Conclusion and Next Steps

Decision-making Environment Conceptual Framework Objectives

Decision-making Environment

• Multiple decisions within a billing period: $x_1, x_2, ... x_S$

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$$w_s = x_s * r_s$$

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A. Backward Uncertainty and Forward Uncertainty :

 $\ldots r_{s-2}, r_{s-1}, r_s, r_{s+1} \ldots$

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$$C\left(\sum_{1}^{S}(w_s)\right) = \begin{cases} p_1 \sum_{1}^{S} w_s & \text{if } \sum_{1}^{S} w_s \le B\\ p_1 B + p_2 (\sum_{1}^{S} w_s - B) & \text{if } \sum_{1}^{S} w_s > B \end{cases}$$

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• Quantity Uncertainty \implies Marginal Price Uncertainty

Decision-making Environment Conceptual Framework Objectives

The Consumer's Problem:

Decision-making Environment Conceptual Framework Objectives

The Consumer's Problem:

$$\max_{\{x_1, x_2...x_S\}} U(x_1, x_2...x_S) + E[V(z)]$$

subject to
$$I = z + C\left(\sum_{1}^{S} (w_s)\right)$$

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The effect of backward uncertainty depends on the rate structure

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Theoretical Predictions:

The effect of backward uncertainty depends on the rate structure and risk preferences (including prudence)

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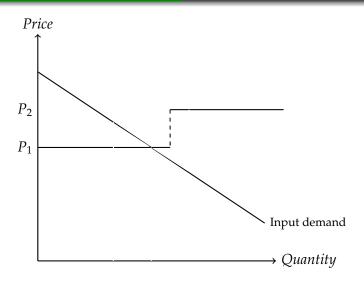
► CMP

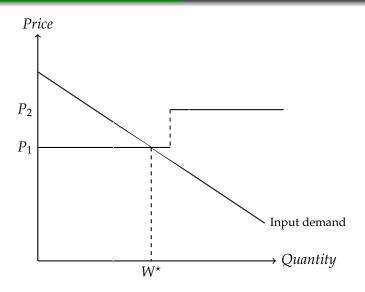
Risk Averse: ↑ Risk Neutral: – Risk Seeking: ↓ IBR

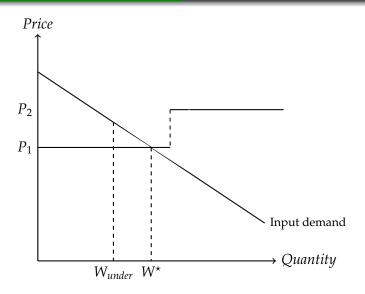
+ Rate structure induces behavior consistent with risk preference behavior

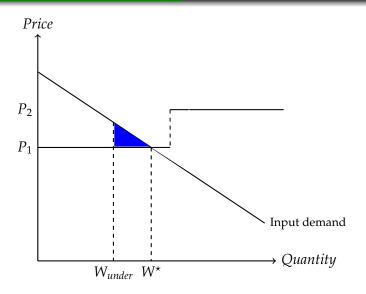
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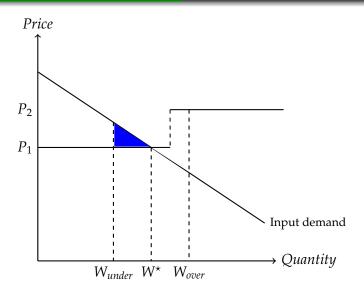
August 5th, 2013

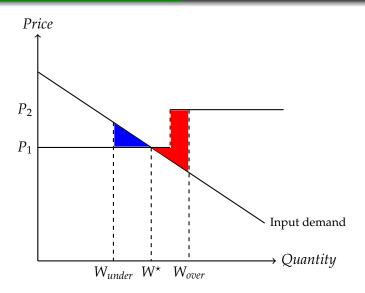












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 - Risk preferences, gender, low vs. high volume consumers, etc.
- **5** Does feedback improve decision-making?

- Decision-making environment \implies inattentive consumers
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 - Risk preferences, gender, low vs. high volume consumers, etc.
- **5** Does feedback improve decision-making?
 - More information \implies Better decisions

Set-up Treatments

Experiment Overview

Participants are producers of an output x

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- Participants are producers of an output x
 - Either high or low value producer

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Set-up

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$$x_s \stackrel{?}{r_s} =$$

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$$x_s \stackrel{?}{r_s} = \stackrel{?}{w_s}$$

• Profit: $\Pi = \left[\sum_{s=1}^4 TR(x_s)\right] - C\left(\sum_{s=1}^4 (w_s)\right)$

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Input requirement is unknown at time of decision:

•
$$x_s \stackrel{?}{r_s} = \stackrel{?}{w_s}$$

• Profit: $\Pi = \left[\sum_{s=1}^4 TR(x_s)\right] - C\left(\sum_{s=1}^4 (w_s)\right)$

- Paid based on cumulative profit
- To elicit risk preferences: Holt-Laury lottery game

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August 5th, 2013

	This is Week 2 of M	Nonth 2	
	Summary of Week 2	Results	
	Revenue Summ	ary	
You chose to prode	ice the following number of outputs	6	
Your revenue	Your revenue from this week's production is		
	Input Use Summ	ary	
This week	's input requirements were	Low	
This week, to produc in	e one ouput, the following number of buts were required	2	
This week, in pro	ducing 6 units of output, you used	12 total inputs	

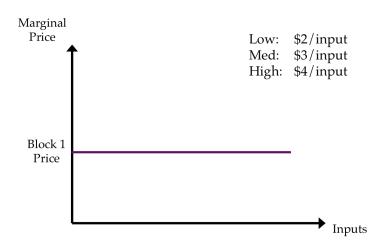
So far this month...

As of right now, the combined total number of inputs used this week and the previous week(s) in this month are

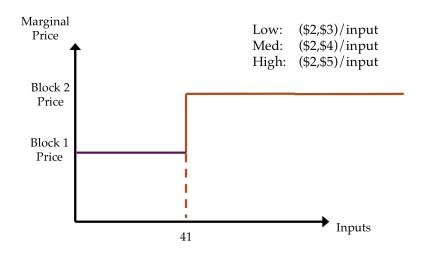
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_	This is Week 2 o		
	Summary of Week	2 Results	
	Revenue Sum	mary	
You chose to produce the following number of outputs		6	
Your revenue from this week's production is		72 lab dollars	
Input Use Summary			
This week's input requirements were		Information not available this week.	
This week, to produce inpu	one ouput, the following number of s were required	Information not available this week	
This week, in produ	cing 6 units of output, you used	Information not available th	is week
So far this month			
	nbined total number of inputs used evious week(s) in this month are	Information not available th	is week

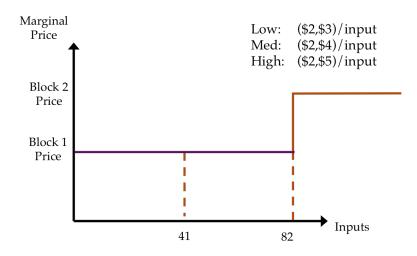
Set-up Treatments



Background Experimental Design Set-up Results **Treatments** Conclusion and Next Steps



Set-up Treatments



Feedback Effect Rate Structure Effect Heterogeneity

Did they understand the experiment?

Feedback Effect Rate Structure Effect Heterogeneity

Did they understand the experiment?

 High value participants produced 35.7% more than low-value participants

Feedback Effect Rate Structure Effect Heterogeneity

Did they understand the experiment?

- High value participants produced 35.7% more than low-value participants
- Produced less (and used fewer inputs) in higher-priced months

Feedback Effect Rate Structure Effect Heterogeneity

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The Effect of Feedback:

Feedback increases consumption

Feedback Effect Rate Structure Effect Heterogeneity

- Feedback increases consumption
 - Output and input demand both increase by $\approx 3.90\%$

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- Feedback reduces price responsiveness:

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The Effect of Feedback:

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 - Output and input demand both increase by $\approx 3.90\%$
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Effect on <i>D_{inputs}</i>	No Feedback	Feedback
P_{med}	-8.70***	-4.28**
P_{high}	-14.56***	-9.57***

Estimates are relative to the lowest price level.



Feedback Effect Rate Structure Effect Heterogeneity

Rate structure influences price responsiveness

Effect on <i>D</i> _{inputs}	CMP	IBR41	IBR82
P _{med}	-6.43**	-10.24***	
P_{high}	-14.24***	-14.62***	-7.82***

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P _{med}	-6.43**	-10.24***	
P_{high}	-14.24***	-14.62***	-7.82***
Feedback	4.41**		

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Effect on <i>D</i> _{inputs}	CMP	IBR41	IBR82
P _{med}	-6.43**	-10.24***	
P_{high}	-14.24***	-14.62***	-7.82***
Feedback	4.41**	3.17**	

Price estimates are relative to the lowest price level.

Feedback Effect Rate Structure Effect Heterogeneity

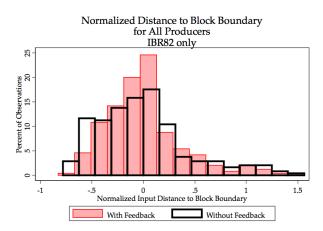
Rate structure influences price responsiveness

Effect on <i>D</i> _{inputs}	CMP	IBR41	IBR82
P _{med}	-6.43**	-10.24***	
P _{high}	-14.24***	-14.62***	-7.82***
Feedback	4.41**	3.17**	1.38

Price estimates are relative to the lowest price level.

Feedback Effect Rate Structure Effect Heterogeneity

Targeting Behavior



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Feedback Effect Rate Structure Effect Heterogeneity

Rate-structured Induced "Risk" Behavior

	Input Totals by Feedback Treatment, Producer					
		Assignment and Risk Preferences				
			(IBR ses	sions only)		
	Low	-value Pro	ducer	High	-value Proc	ducer
	Seeking	Neutral	Averse	Seeking	Neutral	Averse
						+9.1
% Diff			+5.2			
with		+2.9				
Feedback					+0.9	
	-2.6			-3.6		

Expected

below boundary

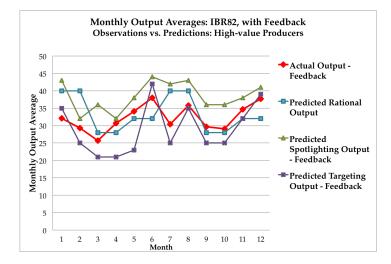
above boundary

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Feedback Effect Rate Structure Effect **Heterogeneity**

Types of Behavioral Models



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Feedback Effect Rate Structure Effect Heterogeneity

Gender:

Feedback Effect Rate Structure Effect **Heterogeneity**

Gender:

Women are more responsive to feedback than men

Feedback Effect Rate Structure Effect **Heterogeneity**

Gender:

- Women are more responsive to feedback than men
- With feedback, output increases by $\approx 7.7\%$

Feedback Effect Rate Structure Effect **Heterogeneity**

Gender:

- Women are more responsive to feedback than men
- With feedback, output increases by $\approx 7.7\%$
 - Men's output only increases by $\approx 1.9\%$... and not stat. sign.

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- Feedback, itself, may not enhance conservation or pricing programs
- Feedback may increase variability in demand
- Rate structure design: block boundary has to matter, block prices have to matter
- Next: further characterize types of decision-makers

Questions?

Thanks!

Contact > Liesel.Hans @ Colostate.edu

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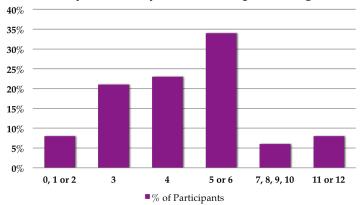
Does feedback improve decision-making?

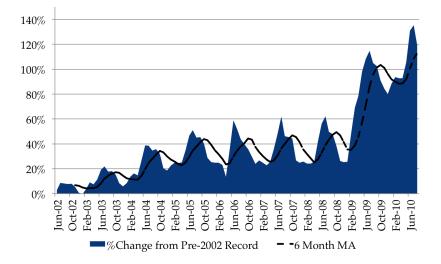
- Sometimes
 - From the survey:
 ⇒ Some said it was harder to make choices with weekly feedback

 \Rightarrow These participants did worse with weekly feedback

Real world connections

Survey: How many times did the price change?

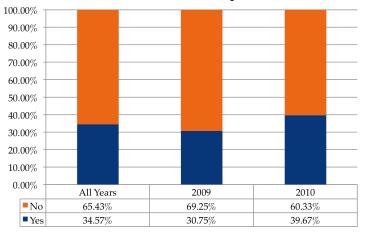




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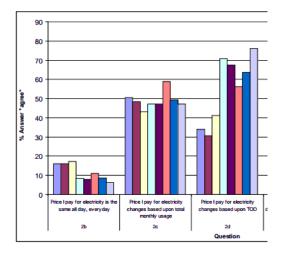
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Are you aware of any recent changes in your water service or water price?



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Participant characteristics:

Table : Summary Statistics

	Average	Min	Max
Gender (1=female)	0.38	0	1
Age (years)	19.26	18	33
Year in College (1=Freshman)	1.61	1	4
Semesters of Econ Courses	1.27	0	15

Participant Characteristics

Table : Treatment Effects: Random Effects Model

Partial Effects on Monthly Input Demand		
Independent Variable Coefficien		
Feedback	2.972***	
	(0.993)	
Producer Type	22.529***	
	(3.188)	
Medium Price Level	-6.289***	
	(1.404)	
High Price Level	-12.208***	
	(1.310)	
IBR82	12.192***	
	(3.913)	
IBR41	6.816***	
	(3.913)	
Average Input Requirements	25.568***	
	(0.863)	
constant	-11.501***	
	(4.198)	
Overall R ²	0.4717	

[◊]Standard errors are in parentheses.

 * , ** , *** denotes p-values of 0.10, 0.05 and 0.01 respectively.



Organization of Sessions

Table : Experiment Timeline

Timing of Prices and Feedback

Month	Price Level	Session A	Session B
1	Low		Weekly Feedback
2	Low	Weekly Feedback	
3	High	Weekly Feedback	
4	High		Weekly Feedback
5	Medium		Weekly Feedback
6	Medium	Weekly Feedback	
7	Low	Weekly Feedback	
8	Low		Weekly Feedback
9	High		Weekly Feedback
10	High	Weekly Feedback	
11	Medium	Weekly Feedback	
12	Medium		Weekly Feedback



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