

# The Influence of Rebate Programs on the Demand for Water Heaters :The Case of New South Wales



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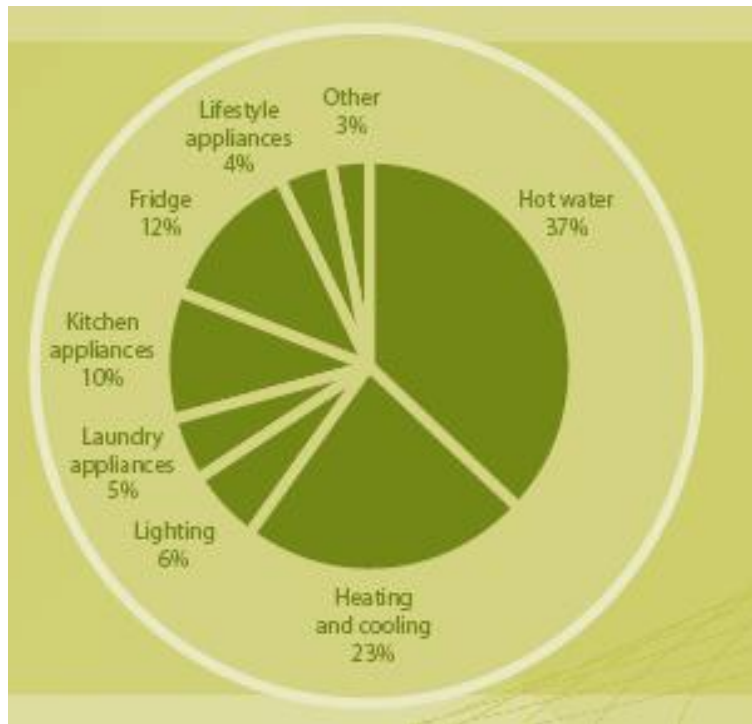
# Background

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- Australia has high per capita greenhouse gas emissions  
Key driving factor: high emission intensity of energy use.
- Various programs from Federal and state governments to promote energy efficiency improvement
- Focuses on the [hot water system rebate programs](#) targeted at New South Wales (NSW) residential sector

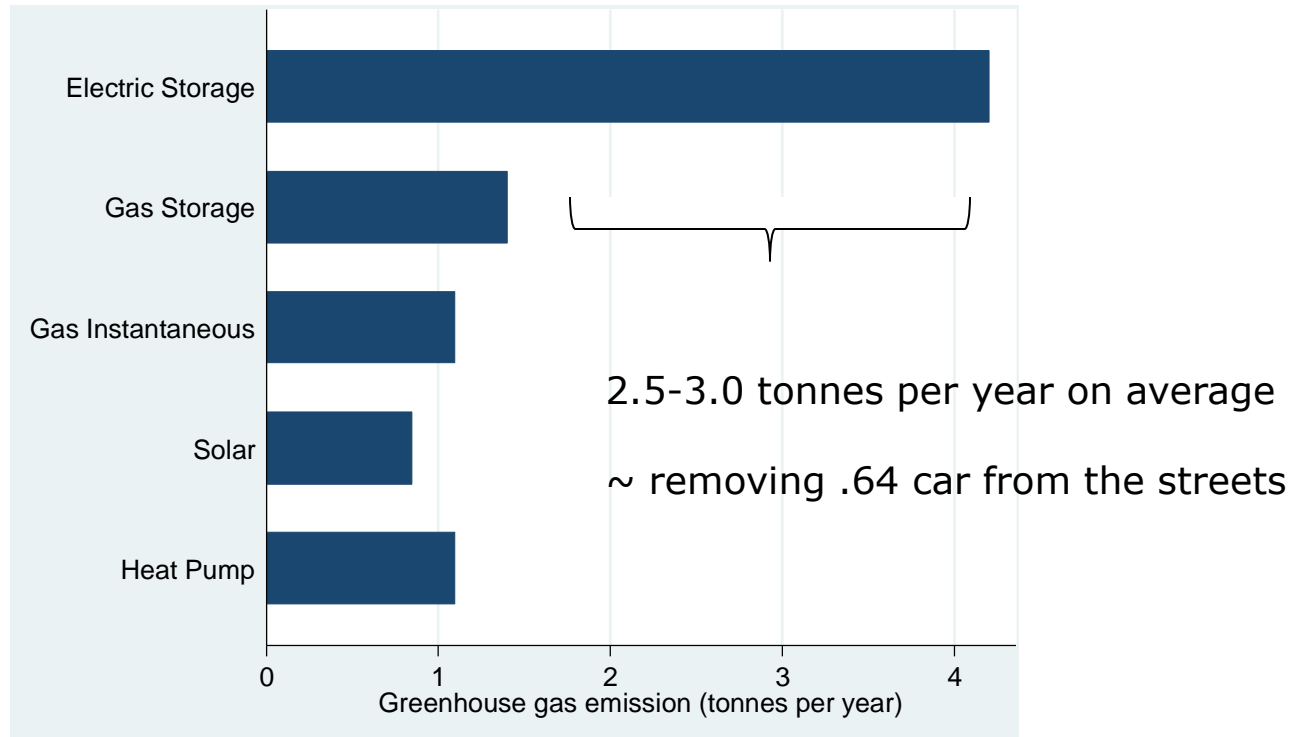
# Energy use in NSW residential sector

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“Water heating is the largest single source of greenhouse gas emissions from the average Australian home”

# Greenhouse gas emission by type of water heaters



# Background

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- Traditionally, most households used electric water heaters
- Share of gas water heaters has risen in the past 3 decades

Shares of solar and heat pump systems remained relatively small (less than 5% in 2005)

- Their high upfront costs are likely to be the key barrier.

electric /gas storage	\$800-\$1000
gas instantaneous	\$1500-\$2000
solar, heat pump	\$3000-\$5000

# Recent rebate programs

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## Australian Government Solar Rebate program

July 2007: \$1000 rebate for solar/heat pump

replace an electric water heater

originally for low income families, later stopped means-testing

## NSW Hot water system rebate program

October 2007 - July 2009 : \$300 for gas

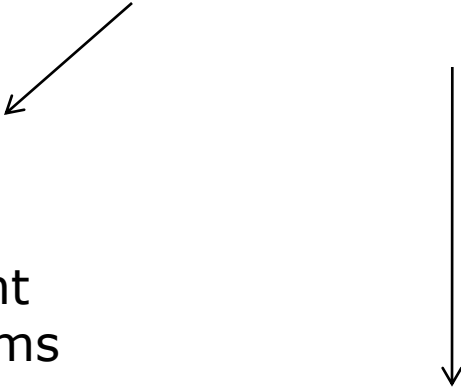
\$600-\$1200 for solar/heat pump

replace an electric water heater

except installation to comply with regulation for new houses

# This paper

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- Assess the effects of these rebate programs on households water heater demand
  - Explicit designed a survey to study recent & future demand
    - Households who recently purchased a heater
      - exploit the natural experiment created by the rebate programs
    - Households with an old water heater (likely to be in the market soon)
      - discrete choice experiments
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# Study design & Data

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- Large web-based panel  
9400 invitations sent to NSW homeowner panelists  
during Dec 2009-January 2010
- **Recent demand** (purchased the heater in 2004 or later)  
# obs = 408 (gas access), 504 (no gas access)  
**Future demand** (age of current heater 10 years+)  
# obs = 547 (gas access), 354 (no gas access)
- Renewable Energy Credits (REC) = existing rebate since 2001  
(baseline situation)

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## Evidence from A Natural Experiment (Recent demand/Revealed Preference respondents)

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## Difference-in-Difference (DID) estimate: Households with gas access

	Before	After	Time difference
<b>Previous type = electric (treatment)</b>	2004-2007	2007-2009	
prob (elec)	<b>0.28</b> (0.04)	<b>0.19</b> (0.04)	<b>-0.09</b> (0.06)
prob (gas)	<b>0.69</b> (0.04)	<b>0.55</b> (0.06)	<b>-0.14</b> (0.07)
prob (solar/heat pump)	<b>0.03</b> (0.01)	<b>0.26</b> (0.05)	<b>0.23</b> (0.05)
<b>Previous type = electric in early years (control)</b>	2004-2005	2006-2007	
prob (elec)	<b>0.39</b> (0.08)	<b>0.22</b> (0.05)	<b>-0.17</b> (0.09)
prob (gas)	<b>0.61</b> (0.08)	<b>0.74</b> (0.05)	<b>0.13</b> (0.09)
prob (solar/heat pump)	<b>0</b>	<b>0.04</b> (0.02)	<b>0.04</b> (0.02)
<b>Effects of policy on</b>			<b>DID</b>
prob (elec)			<b>0.08</b> (0.10)
prob (gas)			<b>-0.27</b> (0.11)
prob (solar/heat pump)			<b>0.19</b> (0.06)

## Difference-in-Difference (DID) estimate: Households with no gas access

	Before	After	Time difference
<b>Previous type = electric (treatment)</b>	2004-2007	2007-2009	
prob (elec)	<b>0.90</b> (0.02)	<b>0.40</b> (0.03)	<b>-0.50</b> (0.04)
prob (solar/heat pump)	<b>0.10</b> (0.02)	<b>0.60</b> (0.03)	<b>0.50</b> (0.04)
<b>Previous type = electric in early years (control)</b>	2004-2005	2006-2007	
prob (elec)	<b>0.94</b> (0.03)	<b>0.87</b> (0.03)	<b>-0.07</b> (0.04)
prob (solar/heat pump)	<b>0.06</b> (0.03)	<b>0.13</b> (0.03)	<b>0.07</b> (0.04)
<b>Effects of policy on</b>			<b>DID</b>
prob (elec)			<b>-0.43</b> (0.06)
prob (solar/heat pump)			<b>0.43</b> (0.06)

## Results

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- Also try to incorporate household size, income, expectation on electricity price (likelihood ratio test rejects a larger model)
- An important factor: whether the replacement is done on emergency/urgent basis

### Gas access

prob (solar/heat pump):

Emergency

+0.09

Nonemergency

+0.24\*\*

### No gas access

prob (solar/heat pump):

Emergency

+0.19\*\*

Nonemergency

+0.46\*\*

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Evidence from Discrete Choice Experiments  
(Future demand/Stated Preference respondents)

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# Designing stated preference survey

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- Respondents with an old water heater are presented with a sequence of hypothetical choice scenarios & are asked to state their most preferred choices.
  - Frame respondents to think about replacing a water heater in a nonemergency context
  - Relevant choices of heaters are determined by:
    - 1) access to gas network?
    - 2) water usage (small, medium or large)?
- 6 types of experiments: 3 usage levels x gas/no gas access

## Example of choice scenario for respondents with gas access, medium water usage

	Electric Off-peak 2	Electric peak	Electric Off peak 1	Gas Storage	Gas Instantaneous	Solar	Heat Pump
Upfront cost	1500	1100	1500	1500	2100	4500	3300
Amount of mail-in rebate	-	-	-	-	300	-	800
<b>Net cost</b>	<b>1500</b>	<b>1100</b>	<b>1500</b>	<b>1500</b>	<b>1800</b>	<b>4500</b>	<b>2500</b>
<b>Annual running costs (\$/year)</b>	<b>500</b>	<b>800</b>	<b>425</b>	<b>325</b>	<b>275</b>	<b>130</b>	<b>160</b>
Which heater is your most Preferred option?	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>

Each respondent answers 16 scenarios

# Model of purchase decision (Random Utility Model)

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Utility of consumer  $n$  from heater  $j$  in scenario  $t$ :

$$U_{njt} = \alpha_{jn} + \delta_{1n} \text{costafterrebate}_{njt} \\ + \delta_{2n} \text{dmailin\_rebate}_{njt} + \delta_{3n} \text{runcost}_{njt} + \varepsilon_{njt}$$

for  $n = 1, 2, \dots, N$ ;  $j = 1, \dots, 5$  or  $7$ ;  $t = 1, \dots, 16$

$\alpha_{jn}$  : alternative specific constant (unobserved value) for heater  $j$

$\varepsilon_{njt}$  : unobserved component

$$\text{prob}(y_{njt} = 1) = \text{prob}(U_{njt} > U_{nit} \text{ for all } i \neq j)$$

Different assumptions on  $\varepsilon_{njt}$  and  $\{\alpha_{jn}, \delta_{1n}, \delta_{2n}, \delta_{3n}\}$

→ different choice models

# Discrete choice models considered

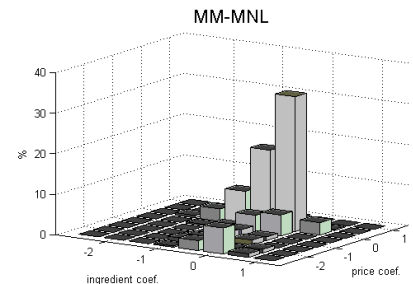
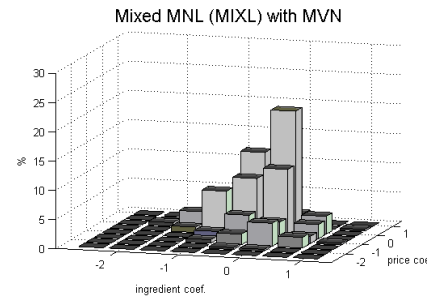
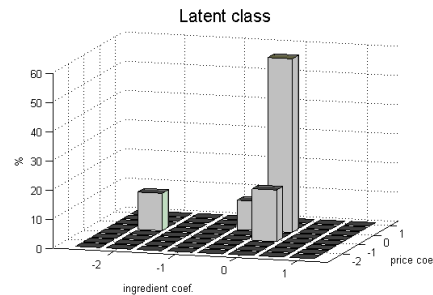
1. Multinomial logit model “MNL”  
(McFadden, 1974)

2. Latent class model  
(Kamakura & Russell, 1989)

3. Mixed logit model  
(McFadden & Train, 2000)

4. Generalized Multinomial Logit model  
(Fiebig, Keane, Louviere, Wasi, 2010)

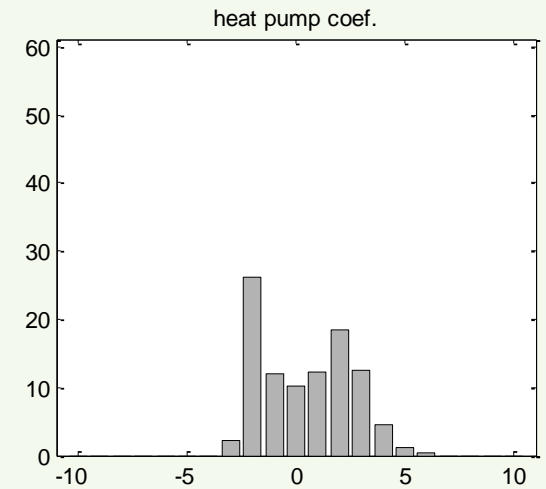
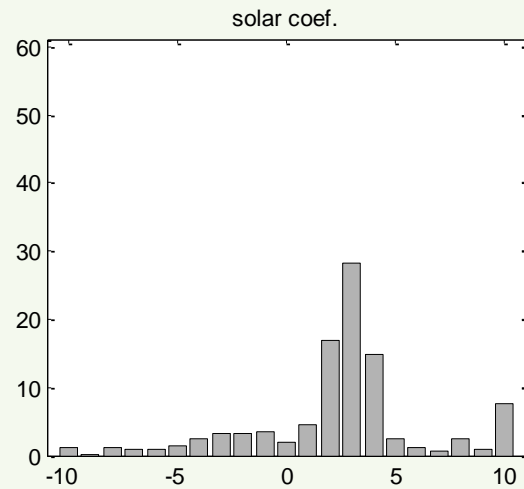
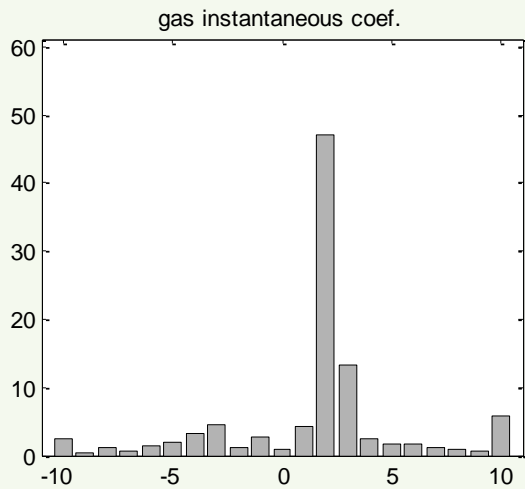
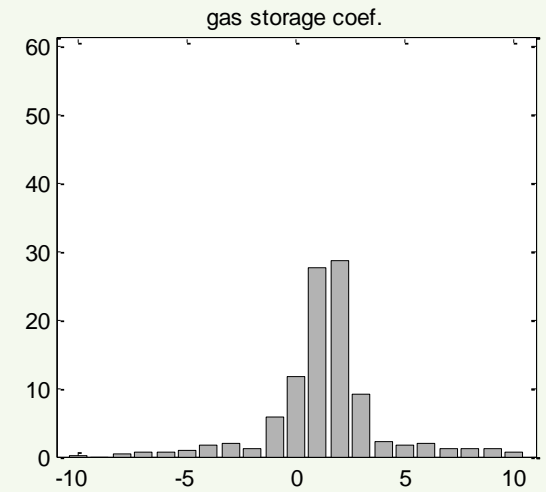
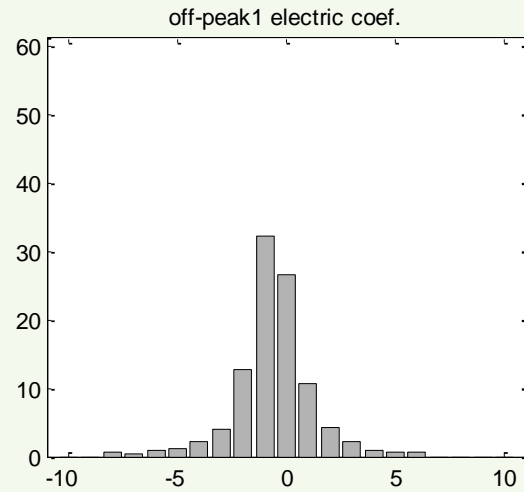
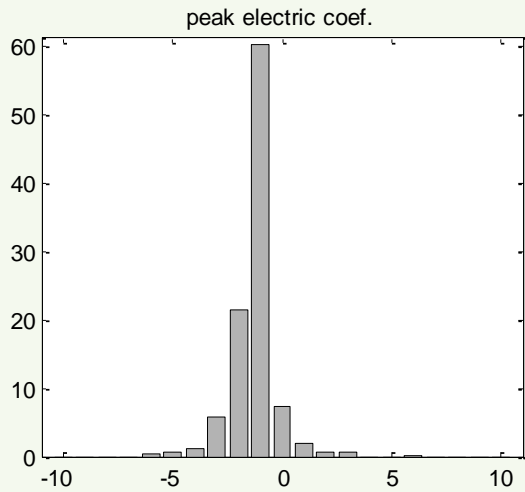
5. Mixture-of-normal mixed logit model  
(Train 2008; Burda et al. 2008; Keane and Wasi, 2010)



# Results: Gas access

	MNL	Latent class						MIXL (correlated)	G-MNL (correlated)	Mixture-of-normals (2 indep.normals)	
		class 1	class 2	class 3	class 4	class 5	class 6			class 1	class 2
<b>Mean</b>											
(omitted electric off-peak2)											
Electric peak	<b>0.44</b>	-0.44	-30	2.14	<b>0.81</b>	-30	12.52	<b>-2.81</b>	<b>1.12</b>	<b>-1.13</b>	<b>-1.35</b>
Electric off-peak 1	<b>0.41</b>	<b>0.92</b>	-0.15	0.41	<b>1.12</b>	<b>-2.53</b>	10.94	<b>-0.54</b>	<b>1.70</b>	-0.02	<b>-1.07</b>
Gas storage	<b>1.38</b>	<b>3.21</b>	0.1	-0.1	<b>0.54</b>	<b>-1.54</b>	13.82	<b>1.83</b>	<b>5.64</b>	<b>1.69</b>	<b>0.90</b>
Gas instantaneous	<b>1.73</b>	<b>2.59</b>	<b>1.35</b>	-0.01	0.004	<b>-0.26</b>	16.06	<b>2.26</b>	<b>6.59</b>	<b>2.26</b>	<b>1.03</b>
Solar	<b>2.5</b>	<b>2.86</b>	<b>2.01</b>	<b>3.91</b>	<b>0.9</b>	0.26	11.81	<b>3.12</b>	<b>7.25</b>	<b>2.76</b>	<b>1.23</b>
Heat pump	<b>1.69</b>	<b>1.89</b>	<b>2.21</b>	<b>2.64</b>	-0.18	<b>-4.73</b>	12.66	<b>1.30</b>	<b>5.32</b>	<b>1.56</b>	<b>-1.71</b>
Cost-after-rebate/10000	<b>-8.62</b>	<b>-18.96</b>	<b>-17.03</b>	<b>-5.73</b>	<b>-13.92</b>	<b>-11.38</b>	<b>-7.74</b>	<b>-22.81</b>	<b>-26.57</b>	<b>-27.30</b>	<b>-16.93</b>
1 if mail-in rebate dummy	0.002	-0.06	<b>0.25</b>	-0.003	<b>-0.29</b>	0.06	-0.03	-0.04	0.03	0.01	<b>-0.28</b>
Annual running cost/1000	<b>-3.99</b>	<b>-5.69</b>	<b>-13.12</b>	<b>-7.5</b>	<b>-1.77</b>	<b>-11.29</b>	<b>-7.07</b>	<b>-16.33</b>	<b>-17.94</b>	<b>-22.02</b>	<b>-9.35</b>
<b>Covariance</b>	no	no						yes	yes	yes	yes
class prob.		<b>0.34</b>	<b>0.21</b>	<b>0.15</b>	<b>0.14</b>	<b>0.09</b>	<b>0.06</b>			<b>0.66</b>	<b>0.34</b>
$\tau$									<b>0.57</b>		
$\gamma^*$									0.03		
No. of parameters	9	59						54	56	37	
Loglikelihood	-12861	-8924						-7447	-7198	-7142	
AIC	25740	17967						14933	14508	<b>14359</b>	
BIC	25804	18384						15075	14904	<b>14620</b>	
CAIC	25813	18443						15095	14960	<b>14657</b>	

# Distribution of taste heterogeneity associated with each type of heater



# Discount rate

$$U_{njt} = \alpha_{jn} + \delta_{1n} \text{costafterrebate}_{njt} + \delta_{2n} \text{dmailin\_rebate}_{njt} + \delta_{3n} \text{runcost}_{njt} + \varepsilon_{njt}$$

$\delta_{3n} / \delta_{1n}$  = willingness-to-pay (WTP) to save \$1 per year for q years (heater lifetime)

$$= \frac{1}{(1+r)} + \frac{1}{(1+r)^2} + \dots + \frac{1}{(1+r)^q}$$

Implied individual discount rates	Gas access Freq (%)	No gas access Freq (%)
Less than 2%	22	26
2-10%	22	23
10-20%	24	18
20-40%	16	10
Higher than 40%	15	23
Median discount rate	12%	10%

# Prediction

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Households who previously own an electric system

Scenario I: change from “no rebate” to “post October 2007 scheme”

	gas access	no gas access
changes in share of solar/heat pump:	20%+	38%+
Actual purchase data, nonemergency	24%+	46%+

# Prediction for other rebate scenarios

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- If rebates were reduced,  
predict substantial reduction in demand for solar/heat pump
- If households who own nonelectric system (mostly gas) were eligible for rebates for solar/heat pump,  
predict that shares of solar/heat pump 20+%

# Conclusions

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- Assess the role of hot water system rebate programs on NSW demand for water heaters
- From **recent actual purchase data**,
  - shares of solar/ heat pump significantly increase.
  - Does it imply reduction in the stock of electric water heaters?
    - Yes -- for households with no gas access
    - Unlikely -- for households with gas access
    - (the increase is offset by the reduction in share of gas heaters)
  - Emergency replacement matters

# Conclusions

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From stated preference data to predict future demand

- Considerable heterogeneity preference toward different types of water heaters & discount rate
- Mixture-of-normal mixed logit model outperforms other models for these data sets
- Predictions are reasonably consistent with actual purchase data.
- Predict sizeable effects of alternative rebate policies on water heater demand.

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Thank you!

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