# Corrective taxes and consumer heterogeneity in the alcohol market

#### Rachel Griffith, Martin O'Connell and Kate Smith

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- In a number of markets consumption can impose negative externalities on other people and on society
  - Typical examples include markets for alcohol, tobacco, motor fuel ...
  - Possibly also some food markets, e.g. sugar
- Provides a rationale for government intervention to reduce excessive consumption
- With homogeneous externalities a tax can fully correct for sub-optimal consumption (Pigou, 1920)

- In more realistic settings effectiveness of policy will depend on relationship between demand responses and externalities
- In some markets externalities are likely to be much larger for some people
  - Important to understand how their response differs from other consumers
  - Optimal tax can be expressed as a weighted average of marginal externalities where weights are demand slopes (Diamond, 1973)
- Most markets have many differentiated products
  - Policy interventions often change relative prices within the market, encouraging intra-market switching
  - Optimal policy will depend on correlation between externalities and preferences across products

- 1 Estimate demand in the alcohol market capturing:
  - Substitution patterns between disaggregate products and in/out of the market
  - How preferences vary with a proxy for consumers' external costs of consumption
- 2 Assess demand response to topical policy changes excise tax reform, minimum prices per unit alcohol
- 3 Use empirical model to characterise optimal system of alcohol taxes
  - Optimal taxes depend on correlation in externalities, product level price elasticities and demand levels.
  - How close is the full optimum (one tax per product) to a constrained system of one tax for all alcohol or one tax for each segment (spirits, beer, cider, wine)

• Consumption externalities are well documented:

- Higher public expenditure on policing and health care
- Victims of alcohol fueled violence and road accidents
- Lower tax revenue and higher welfare payments
- But marginal externalities vary:
  - Nonlinearly with consumption
  - Across people
- Evidence that small set of heavy consumers create substantial majority of externalities
- Our focus will be on the UK off-trade alcohol market
  - Off-trade accounts for 4 in every 5 units of alcohol purchased

- Currently in the UK excise duties are levied on alcohol (over and above VAT)
- Scottish Government has legislated for introduction of minimum unit price
- Rationale for policies is to lower "problem drinking"
  - Success of policy depends on whether it targets externalities creating consumption

- We model substitution across differentiated products in market as well as switching in/out the market
  - Use discrete choice demand framework
- Model heterogeneity in preferences (demands) with a proxy of consumers' external costs of consumption

### Alcohol demand model: overview

Each period *t* consumer chooses between options j = (0, 1, ..., J)

$$U_{jt} = \bar{U}(\mathbf{x}_{jt}; \theta) + \epsilon_{jt}$$

 $\mathbf{x}_{jt}$  are product characteristics  $\theta$  is preferences  $\epsilon_{jt}$  is i.i.d. type I extreme value shock to demand

Choose *j* if  $U_{jt} > U_{kt} \forall k \neq j$ 

### Alcohol demand model: overview

Each period *t* consumer chooses between options j = (0, 1, ..., J)

$$U_{jt} = \bar{U}(\mathbf{x}_{jt}; \theta) + \epsilon_{jt}$$

Denote by  $y_t$  the chosen period t option, then:

$$P(y_t | \mathbf{x_t}; \theta) = \frac{\exp(\bar{U}(\mathbf{x}_{jt}; \theta))}{\sum_k \exp(\bar{U}(\mathbf{x}_{kt}; \theta))}$$

where  $\mathbf{x}_{\mathbf{t}} = (\mathbf{x}_{1t}, ..., \mathbf{x}_{Jt})$ 

### Alcohol demand model: overview

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where  $\mathbf{x}_{\mathbf{t}} = (\mathbf{x}_{1t}, ..., \mathbf{x}_{Jt})$ 

In the standard random coefficient logit model (with micro panel data) can write:

$$P(y_1, ..., y_T | \mathbf{x}_1, ..., \mathbf{x}_T) = \int \prod_{t=1,...,T} P(y_t | \mathbf{x}_t; \theta) dF(\theta)$$

In contrast, we allow systematic preference heterogeneity with a proxy for marginal externality,  $\psi$ 

As a proxy we use a function of long run pre-sample purchasing:  $\psi=\psi(\bar{y}_0)$ 

In our case:

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$$\mathsf{P}(y_1, \dots, y_T | \mathbf{x_1}, \dots, \mathbf{x_T}, \bar{y}_0) = \int \prod_{t=1,\dots,T} \mathsf{P}(y_t | \mathbf{x_t}; \theta) d\mathsf{F}(\theta | \bar{y}_0)$$

### Utility

*i* denotes consumer; each product *j* is available in different sizes *s*. Utility from option (j, s) is:

$$u_{ijst} = \alpha_i p_{jst} + \beta_i w_j + \gamma_i z_{js} + \xi_{ijt} + \epsilon_{ijst}$$

Observed product characteristics:

p\_jst price
w\_j alcohol strength

*z<sub>js</sub>* volume

Unobserved product characteristics:  $\xi_{ijt}$ 

Utility from outside option (0, 0) is:

$$u_{i00t} = \epsilon_{i00t}$$

We base our externality measure on how many units of alcohol a consumer purchased in the preceding calendar year.

 $d=1,\ldots,D$  denotes the consumer groups and  $\mathcal{D}_d$  denotes the set of consumers in group d

We assume that within each group preferences follow a multivariate normal distribution:

$$f(\theta_i|i \in \mathcal{D}_d) = \mathcal{N}(\mu_d, \Omega_d),$$

The unconditional preference distribution is a mixture of normals

$$\theta_i \sim \sum_d \omega_d \cdot f(\theta_i | i \in \mathcal{D}_d)$$

### Externality measure

For observed attributes (on price, strength and size):

$$\left(\begin{array}{c} \alpha_i\\ \beta_i\\ \gamma_i \end{array}\right) \left| i \in \mathcal{D}_d \sim \mathcal{N}\left( \left(\begin{array}{c} \bar{\alpha}_d\\ \bar{\beta}_d\\ \bar{\gamma}_d \end{array}\right) \left(\begin{array}{c} \sigma_d^{\alpha} & \cdot & \cdot\\ \rho_d^{\alpha\beta} & \sigma_d^{\beta} & \cdot\\ \rho_d^{\alpha\gamma} & \rho_d^{\beta\gamma} & \sigma_d^{\gamma} \end{array}\right) \right)$$

### Externality measure

For observed attributes (on price, strength and size):

$$\begin{pmatrix} \alpha_i \\ \beta_i \\ \gamma_i \end{pmatrix} \left| i \in \mathcal{D}_d \sim \mathcal{N} \left( \begin{pmatrix} \bar{\alpha}_d \\ \bar{\beta}_d \\ \bar{\gamma}_d \end{pmatrix} \begin{pmatrix} \sigma_d^{\alpha} & \cdot & \cdot \\ \rho_d^{\alpha\beta} & \sigma_d^{\beta} & \cdot \\ \rho_d^{\alpha\gamma} & \rho_d^{\beta\gamma} & \sigma_d^{\gamma} \end{pmatrix} \right)$$

For the unobserved attribute, we decompose

$$\xi_{ijt} = \eta_{ij} + \zeta_{dk_jt}$$

 $k_j$  are (slightly) more aggregate than j

### Externality measure

For observed attributes (on price, strength and size):

$$\begin{pmatrix} \alpha_i \\ \beta_i \\ \gamma_i \end{pmatrix} \left| i \in \mathcal{D}_d \sim \mathcal{N} \left( \begin{pmatrix} \bar{\alpha}_d \\ \bar{\beta}_d \\ \bar{\gamma}_d \end{pmatrix} \begin{pmatrix} \sigma_d^{\alpha} & \cdot & \cdot \\ \rho_d^{\alpha\beta} & \sigma_d^{\beta} & \cdot \\ \rho_d^{\alpha\gamma} & \rho_d^{\beta\gamma} & \sigma_d^{\gamma} \end{pmatrix} \right)$$

For the unobserved attribute, we decompose

$$\xi_{ijt} = \eta_{ij} + \zeta_{dk_jt}$$

where

$$\eta_i | i \in \mathcal{D}_d \sim \mathcal{N}(\bar{\eta}_d, \Sigma_d)$$

where  $\Sigma_d$  is a diagonal matrix with variance components that are constant within the four alcohol segments (spirits, beer, wine, cider).

- Model allows for a specific form of state dependence: a consumer's decision depends on whether they were a light, moderate or heavy drink in the previous year
- We do not model state dependence arising through the effect of a recent purchase on current behaviour, for example, due to
  - Habits that form over a short time horizon
  - Consumer stockpiling
- Offer reduced form evidence that suggests these forms of short run dynamics are not of first order importance

Details

- Conditional on controls in the model, we assume the  $\epsilon_{ijst}$  shocks are i.i.d.
  - And that therefore we exploit exogenous price variation
- In UK grocery markets pricing is broadly national
- To capture aggregate shocks to demand we include alcohol type-time effects
  - Will absorb effect of seasonality in demand, and
  - Effect on demand of advertising
- We exploit price variation arising from nonlinear pricing across different product sizes within each alcohol type

- We use data from the Kantar Worldpanel for 2010 and 2011
- Observe representative sample of 10,289 households making purchases throughout this time
  - Use 2010 data to construct a measure of long run purchasing behaviour
  - Estimate demand on 2011 data
- Data record all off-trade alcohol purchases
  - 78% of alcohol units are purchases off-trade
- Include detailed information on UPCs purchased including price and detailed product information

- We model each household's weekly alcohol purchases
- If a household buys groceries but no alcohol we model them as choosing the no purchase outside option
  - Alcohol is purchased on 53.4% of household-weeks
- 18% of household-weeks involve the purchase of more than one option
  - We treat these as multiple separate purchase occasions
  - Random coefficients allow for statistical dependence in choices
  - Conditional on these we assume the epsilon demand shocks are independent across multiple purchases

- Policy interventions typically cause the prices of alcohol products to change differentially
- It is likely households will respond to this by switching between products (as well as out of the market)
- There are over 7000 alcohol UPCs purchased in our data: infeasible to estimate demand with such large choice sets
- We aggregate the 7000 products into 79 product-size pairs:
  - we group UPCs with similar attributes
  - and that have similar movements in price
- An option is a product-size pair: for each of the 40 products we define a set of sizes based on the total quantity bought



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	Numb	er of	Average	
Household group:	Households	Purchase occasions	Price per unit (p)	ABV
Less than 7 units	6,435	321,827	51.0	10.1
7-14 units	1,838	113,874	46.6	11.4
14-21 units	814	59,084	44.3	11.7
21-35 units	736	61,554	42.8	12.3
More than 35 units	466	47,174	41.0	13.8

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### Coefficient estimates:

#### observable product attributes

			Full model			Restricted model
Household group:	< 7	7-14	14-21	21-35	> 35	•
Means						
Price	-2.661 (0.410)	-2.912 (0.323)	-2.948 (0.309)	-3.272 (0.317)	-4.556 (0.330)	-3.197 (0.238)
Volume	-0.153 (0.021)	`-0.086́ (0.016)	0.058 (0.011)	0.071 (0.012)	0.141 (0.012)	-0.112 (0.012)
Variances						
Price	1.606 (0.297)	4.009 (0.388)	7.575 (0.576)	4.998 (0.585)	13.943 (1.047)	2.131 (0.214)
Strength	(0.005) (0.108 (0.018)	(0.004) 0.204 (0.020)	(0.001) 0.275 (0.024)	(0.020 (0.002) 0.323 (0.024)	(0.002) 0.323 (0.024)	(0.009 (0.004) 0.272 (0.020)
Covariances						
Price*Volume	-0.114 (0.023)	-0.062	-0.128	0.016	-0.043	-0.033
Price*Strength	-0.102 (0.048)	-0.467	-0.842	-0.782	0.001	-0.039
Volume*Strength	-0.016 (0.006)	-0.043 (0.005)	`-0.008 (0.004)	0.007 (0.005)	0.002 (0.002)	0.065 (0.005)
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### Joint distribution of price and volume coefficients



### Coefficient estimates:

unobservable product attributes

			Full model			Restricted model
Household group:	< 7	7-14	14-21	21-35	> 35	
Mean product effects for each segment	_					
Beer	-4.637	-3.422	-3.326	-2.651	-1.401	-3.357
Wine	-4.252	-2.700	-2.306	-1.823	-0.290	-3.046
Spirits	-5.837	-3.876	-3.182	-2.342	-0.360	-4.478
Cider and FABs	(0.238) -5.392 (0.310)	(0.172) -4.257 (0.243)	(0.171) -3.863 (0.222)	(0.163) -3.094 (0.224)	(0.173) -1.761 (0.237)	(0.137) -4.046 (0.175)
Variances						
Beer	2.122 (0.242)	1.706 (0.150)	2.140 (0.181)	2.280 (0.249)	1.136 (0.132)	1.961 (0.133)
Wine	1.634	1.092	1.349 (0.116)	1.907	1.995 (0.170)	2.019 (0.133)
Spirits	0.691	0.913	0.898	1.468	1.405	1.162
Cider and FABs	(0.219) (0.219)	3.085 (0.306)	(0.314) (0.314)	(0.274)	2.007 (0.195)	2.325 (0.205)

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Alcohol demand

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### Joint distribution of price and spirits coefficients



- Heavy drinkers have higher own price elasticities
- But also higher (within market) cross price elasticities

	Household group					
	< 7	7-14	14-21	21-35	> 35	
Own price elasticity	-1.16	-1.20	-1.22	-1.35	-1.67	
	[-1.43,-0.83]	[-1.45,-0.92]	[-1.43,-1.02]	[-1.65,-1.13]	[-1.97,-1.34]	
Cross price elasticity	0.010	0.017	0.023	0.029	0.041	
	[0.007,0.013]	[0.012,0.020]	[0.020,0.028]	[0.024,0.036]	[0.033,0.049]	

Distributions

# Cross price elasticities with respect to price of a spirit option



### Cross price elasticities with respect to price of a strong spirit option



### Price elasticity for all alcohol

Can simulate change in alcohol units demanded if all prices rise by 1%



### Policy simulations - MUP

- We use the model of alcohol demand to simulate the introduction of a minimum unit price for alcohol illustrative rate of 45p in 2012
- Policy affects a higher proportion of units purchased by heavy drinkers



### But proportionate demand effect is similar for light and heavy drinkers



- Alternative to MUP is reform of alcohol duties
- System is ripe for reform ...

### Current alcohol duties



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May 2016 33 / 39

### Current alcohol duties



### Current alcohol duties



- Alternative to MUP is reform of alcohol duties
- System is ripe for reform ...
- Here I'll consider simple reform, not in conflict with EU law ...
- Increase in spirits duties
  - We choose increase that results in same reduction in total units sold as under MUP
  - Would reverse long run decline in spirits duty (same as real level in early 1980s)

### Results in similar reductions across light-heavy drinkers as MUP



- Both reforms lead to similar reductions in alcohol for heavy drinkers, with tax reform having less effect on lightest drinkers
- However tax reform has the significant advantage of raising more revenue
  - While the MUP *reduces* tax revenue by 2.4% (and also raising industry revenue by 12.5%)
  - The tax reform raises tax revenue by 4.5%

- Demand model captures consumer substitution across products in alcohol market as well as out of market
- It incorporates rich preference heterogeneity, allowing systematic differences in behaviour with a proxy of consumption externality
- Model is well suited for considering demand response to policies that change prices in market
  - Do policies successfully target high externality types?
- What can we say about optimal policy? ...

- We can also use framework to characterise excise tax system
- Let post tax prices, p = q + t, q are pre-tax prices and t are excise taxes and denote by s a lump sum transfer
- We can solve:

$$\max_{\mathbf{p},s} W(\mathbf{p},s) = \sum_{i} \left[ \alpha_{i}(y_{i}+s) + V(\mathbf{p},\mathbf{x},\psi_{i};\theta_{i}) - \sum_{j=1}^{J} \psi_{i}f_{j}(\mathbf{p},\mathbf{x},\psi_{i};\theta_{i}) \right]$$
  
s.t. 
$$\sum_{i} \sum_{j=1}^{J} (p_{j}-q_{j})f_{j}(\mathbf{p},\mathbf{x},\psi_{i};\theta_{i}) \ge sN$$

- Yields set of welfare maximising excises taxes:  $t_i^* \forall j$
- Solution will depend in relationship between demands, elasticities and externalities
- For example, with zero cross price effects and constant marginal utility of income, solution collapses to Diamond (1973):

$$t_j^* = rac{ar{\psi}}{lpha} + rac{\mathsf{cov}(\psi_i, \epsilon_{ij})}{lpha ar{\epsilon}_j}$$

- How does solution compare to optimum when:
  - Tax per unit of alcohol is constant across all goods
  - A different tax is permitted in each segment
  - Current tax system

### Additional slides

- Our externality proxy does allow purchase patterns to systematically vary with historic/long run purchases
- An issue would arise if the data exhibit state dependence at shorter frequencies
  - If a household's purchase this week is causally related to their recent demand
- We provide reduced form evidence that such patterns in the data reflect spurious state dependence (Heckman, 1981)
  - Once controlling for unobserved preference heterogeneity, evidence of "high frequency" state dependence is weak

- We regress:
  - $\bullet \mbox{ dummy} = 1$  if household purchased alcohol in week, and
  - total units conditional on purchasing
- on total number of units purchased per adult in each of last 8 weeks, week effects and household fixed effects

Habits

	Purchased alcohol?	Purchased alcohol?	Quantity	Quantity
Number of units purchased per adult:				
- 1 week before	0.0016 (0.0001)			
- 2 weeks before	0.0024 (0.0001)			
– 3 weeks before	0.0022 (0.0001)			
- 4 weeks before	0.0023 (0.0001)			
– 5 weeks before	0.0021 (0.0001)			
– 6 weeks before	0.0019 (0.0001)			
– 7 weeks before	0.0019 (0.0001)			
– 8 weeks before	0.0021 (0.0001)			
Mean of dependent variable Time effects? Household fixed effects?	0.3833 Yes No			
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	Purchased alcohol?	Purchased alcohol?	Quantity	Quantity
Number of units purchased per adult:				
- 1 week before	0.0016 (0.0001)	-0.0005 (0.0001)		
- 2 weeks before	0.0024 (0.0001)	0.0002 (0.0001)		
- 3 weeks before	0.0022 (0.0001)	0.0001 (0.0001)		
– 4 weeks before	0.0023 (0.0001)	0.0001 (0.0001)		
– 5 weeks before	0.0021 (0.0001)	-0.0000 (0.0001)		
– 6 weeks before	0.0019 (0.0001)	-0.0002 (0.0001)		
- 7 weeks before	0.0019 (0.0001)	-0.0002 (0.0001)		
– 8 weeks before	0.0021 (0.0001)	-0.0001 (0.0001)		
Mean of dependent variable Time effects? Household fixed effects?	0.3833 Yes No	0.3833 Yes Yes		

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Alcohol demand

39/39

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	Purchased alcohol?	Purchased alcohol?	Quantity	Quantit
Number of units purchased per adult:				
– 1 week before	0.0016	-0.0005	0.0942	
	(0.0001)	(0.0001)	(0.0028)	
– 2 weeks before	0.0024	0.0002	0.1238	
	(0.0001)	(0.0001)	(0.0028)	
– 3 weeks before	0.0022	0.0001	0.1079	
	(0.0001)	(0.0001)	(0.0028)	
– 4 weeks before	0.0023	0.0001	0.1132	
	(0.0001)	(0.0001)	(0.0029)	
– 5 weeks before	0.0021	-0.0000	0.1017	
	(0.0001)	(0.0001)	(0.0029)	
– 6 weeks before	0.0019	-0.0002	0.0953	
	(0.0001)	(0.0001)	(0.0029)	
- 7 weeks before	0.0019	-0.0002	0.1020	
	(0.0001)	(0.0001)	(0.0029)	
– 8 weeks before	0.0021	-0.0001	0.1074	
	(0.0001)	(0.0001)	(0.0029)	
Mean of dependent variable	0.3833	0.3833	19.7637	
Time effects?	Yes	Yes	Yes	
Household fixed effects?	No	Yes	No	
		20 / 20		

Habits

0.0016 (0.0001) 0.0024 (0.0001) 0.0022 (0.0001) 0.0023 (0.0001) 0.0021 (0.0001)	-0.0005 (0.0001) 0.0002 (0.0001) 0.0001 (0.0001) (0.0001) -0.0000 (0.0001)	0.0942 (0.0028) 0.1238 (0.0028) 0.1079 (0.0028) 0.1132 (0.0029) 0.1017	-0.015 (0.002 0.011 (0.002 0.001 (0.002 0.010 (0.002 0.000
0.0016 (0.0001) 0.0024 (0.0001) 0.0022 (0.0001) 0.0023 (0.0001) 0.0021 (0.0001)	-0.0005 (0.0001) 0.0002 (0.0001) 0.0001 (0.0001) 0.0001 (0.0001) -0.0000 (0.0001)	0.0942 (0.0028) 0.1238 (0.0028) 0.1079 (0.0028) 0.1132 (0.0029) 0.1017	-0.015 (0.002 0.011 (0.002 0.001 (0.002 0.010 (0.002 0.000
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(0.0001) 0.0022 (0.0001) 0.0023 (0.0001) 0.0021 (0.0001)	(0.0001) 0.0001 (0.0001) (0.0001) -0.0000 (0.0001)	(0.0028) 0.1079 (0.0028) 0.1132 (0.0029) 0.1017	(0.002 0.001 (0.002 0.010 (0.002 0.000
0.0022 (0.0001) 0.0023 (0.0001) 0.0021 (0.0001)	0.0001 (0.0001) 0.0001 (0.0001) -0.0000 (0.0001)	0.1079 (0.0028) 0.1132 (0.0029) 0.1017	0.001 (0.002 0.010 (0.002 0.000
(0.0001) 0.0023 (0.0001) 0.0021 (0.0001)	(0.0001) 0.0001 (0.0001) -0.0000 (0.0001)	(0.0028) 0.1132 (0.0029) 0.1017	(0.002 0.010 (0.002 0.000
0.0023 (0.0001) 0.0021 (0.0001)	0.0001 (0.0001) -0.0000 (0.0001)	0.1132 (0.0029) 0.1017	0.010 (0.002 0.000
(0.0001) 0.0021 (0.0001)	(0.0001) -0.0000 (0.0001)	(0.0029) 0.1017	(0.002 0.000
0.0021 (0.0001)	-0.0000	0.1017	0.000
(0.0001)	(0.0001)		
	(0.0001)	(0.0029)	(0.002
0.0019	-0.0002	0.0953	-0.003
(0.0001)	(0.0001)	(0.0029)	(0.002
0.0019	-0.0002	0.1020	0.001
(0.0001)	(0.0001)	(0.0029)	(0.002
0.0021	-0.0001	0.1074	0.006
(0.0001)	(0.0001)	(0.0029)	(0.002
0.3833	0.3833	19.7637	19.76
Yes	Yes	Yes	Yes
Yes No	Yes Yes	Yes No	Yes Yes
	0.3833	0.3833 0.3833	0.3833 0.3833 19.7637

- We follow Hendel and Nevo (2006): construct an weekly inventory based on a constant rate of consumption and regress:
  - dummy = 1 if household purchased alcohol in week, and
  - total units conditional on purchasing
- on inventory, week effects and household fixed effects

	(1) Purchase alcohol?	(2) Quantity
Inventory	0.0015 (0.0000)	0.0897 (0.0010)
Mean of dependent variable Time effects? Household fixed effects?	0.3833 Yes Yes	19.7637 Yes Yes

	Product $(j)$	Size (s)	Alcohol unit share (%)	Price (pence/ unit)	Alcohol strength (ABV)
(1) (2) (3) (4)	Ale: low strength Ale: mid strength, bottles	c. 500ml c. 4x440ml c. 12x440ml c. 500ml	0.03 0.28 1.88 0.09	79.95 57.58 44.37 69.78	3.85 3.63 3.53 4.53
(5) (6) (7) (8)	Ale: mid strength, cans Ale: high strength	> 1x500ml c. 4x500ml c. 500ml > 1x500ml	1.11 0.33 0.12 1.30	60.73 44.69 61.32 52.87	4.53 4.49 5.66 5.59
(9) (10) (11) (12)	Lager: branded, low strength	c. 4x440ml c. 12x440ml c. 20x440ml c. 4x330ml	0.26 1.50 4.12 0.21	53.82 43.68 37.44 58.87	3.84 3.91 3.93 4.65
(13) (14) (15)	Lager: branded, high strength, bottles	c. 12x330ml c. 660ml c. 4x330ml	0.41 0.06 0.16	47.48 59.26 56.50 40.06	4.62 5.27 5.16
(10) (17) (18) (19)	Lager: branded, high strength, cans	c. 12x275ml c. 15x275ml c. 4x440ml c. 10x440ml	0.36 2.09 0.36 2.98	49.90 41.93 44.19 39.17	5.02 5.53 5.32
(20) (21) (22) (23)	Lager: store brand Stout	c. 4×500ml c. 500ml c. 4×440ml c. 10×440ml	1.88 0.02 0.14 0.58	33.46 75.48 67.43 54.14	4.19 4.88 4.08 4.10

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	Product $(j)$	Size $(s)$	Alcohol unit share (%)	Price (pence/ unit)	Alcohol strength (ABV)
(24)	Red wine: store brand	c. 750ml	1.43	45.69	12.50
(25)		> 1x750ml	4.26	41.14	12.49
(26)	Red wine: branded	c. 750ml	2.20	52.38	12.57
(27)		c. 2x750ml	2.09	50.85	12.50
(28)		> 2x750ml	7.99	46.33	12.57
(29)	White wine: still, store brand	c. 750ml	1.27	47.25	12.06
(30)		> 1x750ml	4.20	42.31	11.80
(31)	White wine: still, branded	c. 750ml	2.05	53.12	12.20
(32)		c. 2x750ml	1.97	51.55	12.23
(33)		> 1x750ml	6.93	46.65	12.30
(34)	White wine: sparkling, store brand	c. 750ml	0.21	69.49	9.73
(35)		> 1x750ml	0.24	58.12	10.46
(36)	White wine: sparkling, branded	c. 750ml	0.36	79.83	9.90
(37)		> 1x750ml	1.35	45.83	8.30
(38)	Rose wine: still, store brand	c. 750ml	0.44	45.59	11.90
(39)		> 1x750ml	0.71	41.14	11.76
(40)	Rose wine: still, branded	c. 750ml	1.04	54.20	11.42
(41)		> 1x750ml	1.78	49.51	11.25
(42) (43) (44)	Rose wine: sparkling, store brand Rose wine: sparkling, branded	c. 750ml c. 750ml > 1x750ml	0.15 0.19 0.17	65.09 73.21 70.60	8.35 10.08 9.48

Alcohol demand

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### Spirits

	Product $(j)$	Size $(s)$	Alcohol unit share (%)	Price (pence/ unit)	Alcohol strength (ABV)
(45)	Brandy	c. 700ml	1.24	45.10	37.29
(46)		c. 1.4l	1.26	42.31	37.03
(47)	Gin; store brand	c. 700ml	0.65	35.47	38.32
(48)		c. 1.4l	1.13	34.92	38.45
(49)	Gin; branded	c. 700ml	0.52	44.07	38.00
(50)		c. 1.4l	1.18	41.24	38.37
(51)	Rum	c. 700ml	0.71	43.52	37.06
(52)		c. 1.4l	1.44	39.91	37.05
(53)	Vodka; store brand	c. 700ml	0.77	36.78	37.58
(54)		c. 1.4l	1.51	35.82	37.50
(55)	Vodka; branded	c. 700ml	0.89	41.28	37.69
(56)		c. 1.4l	2.68	37.77	37.59
(57)	Whisky; store brand	c. 700ml	1.05	41.41	40.00
(58)		c. 1.4l	1.86	39.11	40.00
(59)	Whisky; branded	c. 700ml	2.26	52.48	40.18
(60)		c. 1.4l	5.17	41.10	40.05
(61)	Liqueurs	c. 700ml	1.06	65.51	21.48
(62)		c. 1.4l	1.50	61.51	20.55
(63)	Port	c. 750ml	0.60	49.12	19.78
(64)	Sherry	c. 750ml	1.29	41.91	16.75
(65)	Vermouth	c. 1.4l	0.74	37.28	14.97
(66)	Other fort. wine	c. 1l	1.13	38.48	14.54



Griffith, O'Connell and Smith (IFS)

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### Spirits

	Product $(j)$	Size $(s)$	Alcohol unit share (%)	Price (pence/ unit)	Alcohol strength (ABV)
(45)	Brandy	c. 700ml	1.24	45.10	37.29
(46)		c. 1.4l	1.26	42.31	37.03
(47)	Gin; store brand	c. 700ml	0.65	35.47	38.32
(48)		c. 1.4l	1.13	34.92	38.45
(49)	Gin; branded	c. 700ml	0.52	44.07	38.00
(50)		c. 1.4l	1.18	41.24	38.37
(51)	Rum	c. 700ml	0.71	43.52	37.06
(52)		c. 1.4l	1.44	39.91	37.05
(53)	Vodka; store brand	c. 700ml	0.77	36.78	37.58
(54)		c. 1.4l	1.51	35.82	37.50
(55)	Vodka; branded	c. 700ml	0.89	41.28	37.69
(56)		c. 1.4l	2.68	37.77	37.59
(57)	Whisky; store brand	c. 700ml	1.05	41.41	40.00
(58)		c. 1.4l	1.86	39.11	40.00
(59)	Whisky; branded	c. 700ml	2.26	52.48	40.18
(60)		c. 1.4l	5.17	41.10	40.05
(61)	Liqueurs	c. 700ml	1.06	65.51	21.48
(62)		c. 1.4l	1.50	61.51	20.55
(63)	Port	c. 750ml	0.60	49.12	19.78
(64)	Sherry	c. 750ml	1.29	41.91	16.75
(65)	Vermouth	c. 1.4l	0.74	37.28	14.97
(66)	Other fort. wine	c. 1l	1.13	38.48	14.54

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	Product $(j)$	Size $(s)$	Alcohol unit share (%)	Price (pence/ unit)	Alcohol strength (ABV)
(67)	Dry cider, low strength	c. 1l	0.18	65.20	4.39
(68)		c. 4l	1.71	39.26	4.38
(69)	Dry cider, high strength, store brand	c. 2l	0.21	29.11	5.81
(70)		c. 5l	1.16	20.62	5.70
(71)	Dry cider, high strength, branded	c. 500ml	0.13	47.13	6.61
(72)		c. 2l	0.43	35.09	6.00
(73)		c. 12×440ml	2.55	29.57	5.60
(74)	Pear cider	c. 568ml	0.13	55.55	4.74
(75)		c. 3l	0.63	40.75	4.85
(76)	Fruit cider	c. 1l	0.25	79.33	4.53
(77)	Pre-mixed spirit	c. 750ml	0.11	91.23	6.13
(78)	Alcopops	c. 700ml	0.08	90.76	4.91
(79)		c. 2x700ml	0.31	85.01	4.59

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### Conditional distributions of price elasticities



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