Methods & Results

Alex Dickson¹, Markus Gehrsitz^{1,2}, Jonathan Kemp^{1,3}

¹University of Strathclyde

²Institute of Labor Economics (IZA)

³AG Barr Plc

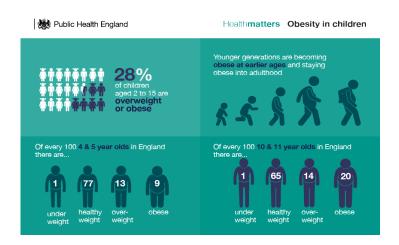
American Economic Association Annual Meeting HERO Session, 8 January 2023

Obesity in the UK

Motivation

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About two thirds of adults are overweight or obese



Motivation

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Clever tax-design: In March 2016 UK Government announced a levy of £0.29 per litre (incl. VAT) on high-sugar SSBs to be enacted in April 2018

• Crucially: Beverages with <5g of sugar per 100ml are exempt!

Data on sugar and calorie contents allow us to analyse supply side responses which have been all but ignored by previous literature

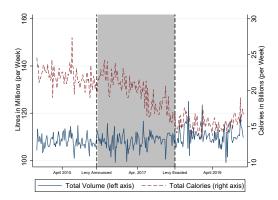
 Product reformulation accounts for more than 80% of calorie reductions induced by UK sugar levy!

Motivation

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Preview: Calorie Reductions are Due to Reformulation

Figure 1: Aggregate weekly consumption for main UK soft drinks brands by volume (in millions of litres) and calories (in billions).



Notes: This figure shows weekly sales volume and calorie consumption for the top 100 brands in our data.

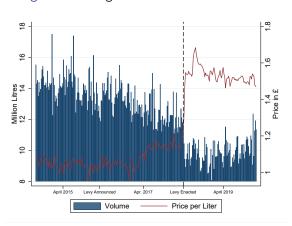
Motivation

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Preview of Results: Levy is Over-shifted

Moderate Demand Response and Shift into Diet Products

Figure 2: Pricing and Volume of Levied Colas



The UK Soft Drinks Industry Levy (SDIL)

Incentive and Time to Reformulate

- Time lag: Announced in March 2016, implemented in April 2018
- Tiered Nature:
 - Beverages with <5g of sugar per 100ml: zero levy
 - Beverages with 5-8g of sugar per 100ml: 18p levy
 - Beverages with >8g of sugar per 100ml: 24p levy
- Levied at manufacturer level, subject to 20% VAT
- Exceptions for milk-based drinks and fruit juices without added sugar

Substantial: Assuming 100% pass-through, price of 2l bottle increases by 57.6p!

Data on Near-Universe of Soft Drink Sales

Collected by IRi, accessed through AG Barr Plc

Electronic Point of Sale (EPOS) weekly data for **all** mainstream supermarket and convenience stores in UK from 27 July 2014 to 26 January 2020

- 45,000 stores, no coverage of continental discounters and some value retailers, and the on-trade
- Accurate read on drink-now segment (household panels capture less than 1/3 of spending)

Conduct our analysis at either brand level (focus on 100 most important brands) or market level to avoid betraying any commercially sensitive information

- Exceptions when information is in public domain
- Collected nutritional information over time

4 Groups of Brands

Levied: High sugar and subject to 24ppl levy. Colas or energy drinks.

Methods & Results

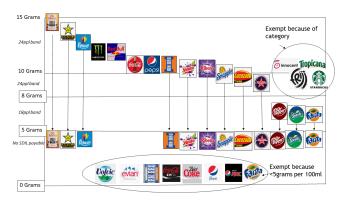
- Reformulated: Changed their recipes and as a result either partly but usually entirely avoided the levy
- Oiet: Artificially sweetened, sugar free containing virtually no calories. All of these brands have variants either in the reformulated or levied category.
- Non-Levied: Exempt or low sugar (pre-announcement!) category, e.g. water and some lemonades.



Seasonal Adjustments

ormulation. Specific Brands

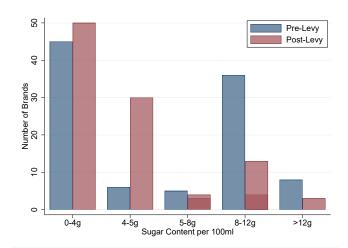
Figure 3: Brands by sugar content pre- and post-levy implementation.



Notes: Brands logos are owned by AG Barr Plc, the Coca-Cola-Company, Desnoes and Geddes Ltd, Dr Pepper Snapple Group, Group Danone, Monster Beverage Corp, Mueller Milk & Ingredients, Nestle Waters, Nichols Plc, PepsiCo, Red Bull GmbH, Starbucks Corporation, and Suntory Holdings Ltd, respectively, and were reproduced under the S30 Copyright, Designs and Patents Act 1988 (CDPA).

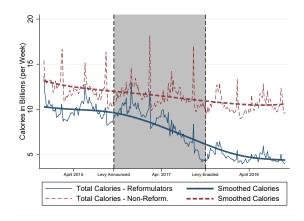
Reformulation: Graphical Evidence

Figure 4: Brands by sugar content pre- and post-levy implementation.



Reformulation: Graphical Evidence

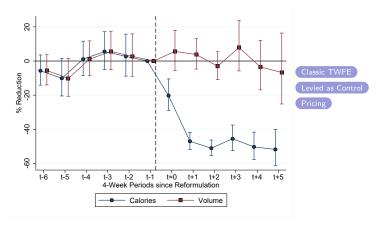
Figure 5: Total Calories Consumed: Reformulators vs Non-Reformulators



Event-Study Results (Sun & Abraham, 2021)

No effect on price or sales, but 50% drop in calories

Figure 6: Effect of reformulation on sales and calories consumed



Summary of Results - Reformulation

Don't just ignore the supply side!

Manufacturers' responses are primary driver of SDIL's success:

- Reformulation reduced calorie consumption from affected beverages by about half - before tax even went into effect!
- Neither volume nor pricing changed
- In most cases, consumers did not even notice changes
 - IrnBru is the main exception
 - Traffic light for nutritional information unchanged



 Reformulation accounted for more than 80% (sic!) of tax-induced calorie reductions

Next: Effect of Levy Implementation

Pricing, Demand-Response, Substitution

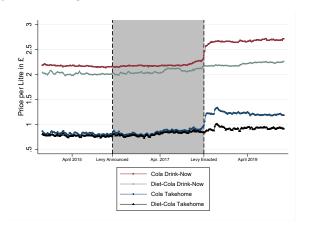
- Single policy change affecting entire market, so no natural control group for levied products.
- But: Striking break in price and volume trends allow us to quantify effects in descriptive analysis.
- Quantify effect sizes via interrupted time series approach (aka RDD-in-time):

$$y_{ct}^{res} = \alpha + f(Time_t) + \beta Post_t + \gamma Post_t \times f(Time_t) + \epsilon_{ct}$$
 (1)

Prices for Colas

28.8p levy is overshifted

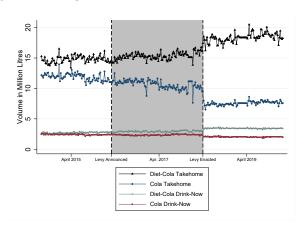
Figure 7: Pricing trends - Levied Colas and Diet Substitutes



Volume Response for Colas

About 20% Drop in Volume

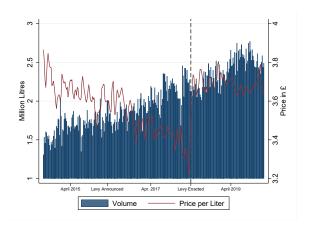
Figure 8: Pricing trends - Levied Colas and Diet Substitutes



Pricing and Volume for Energy

Take-Home and Diet-Segment are negligible!

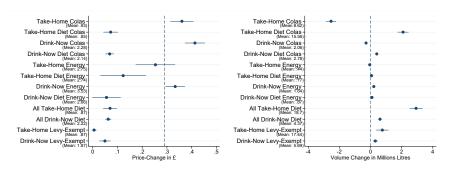
Figure 9: Price and Volume Trends - Levied Energy Drinks



Point Estimates for Price and Volume Response

Drop in Take-Home Full-Sugar Colas is made up by Diet-Cola Sales

Figure 10: Results Interrupted Time-Series Estimation



(a) Change in Price per Litre

(b) Change in Weekly Volume

Summary of Results - Levy Implementation

Effect of the Levy on Levied Colas:

- Evidence for tax-overshifting. For take-home colas: About a 40% price increase!
- Demand response is significant. For take-home colas: About a 20% drop in consumption!
- Suggests inelastic demand.

Effect of the Levy on Diet-Colas/Products:

- Diet-Versions of levied product increased prices by 8-10p/litre.
- Increase in Diet-Cola Consumption all but offsets drop in levied cola consumption.
- Suggests substitution.

Effect of the Levy on Energy Drinks:

Levy is slightly overshifted, but no demand response

More Detail and Robustness

Quite a few contributing factors:

- Price point targeting is an important feature "Pricing in the
- Margin preservation for **both** manufacturer and retailer POR
- Container size changes Coke Bottle Size
- General inflationary pressures (present, lagged, anticipated) amid sticky prices and menu costs
- Results are not driven by differential promotion activity Promotion
- Results are not driven by changes in distribution Distribution
- Selection of Top 100 brands unlikely to miss substitution behavior
 - Most of missing coverage are own-brand labels
 - Own-brands virtually non-existent for colas and energy





Calorie Calculations

Reduction from 100 most important brands

 Reformulation results indicate calorie reduction of about 5.1 billion calories per week from reformulated products.

Methods & Results

- Levy-implementation (and associated substitution) cut about another 1 billion calories per week.
- Over our entire analysis period, calorie intake dropped from about 23bn to 15bn.

Two conclusions:

- Levy was a massive accelerator of underlying trends (on both supply and demand side) towards lower-calorie beverages
- Reformulation was the main driver accounting for over 80% of calorie reductions

Total Calorie Reduction

Back of the Envelope Calculations



Overall estimated calorie reduction (conservatively estimated) is 8.5bn calories per week.

- 6.3bn from off-premise sales, 0.9bn from other retail channels, 1.3bn from Foodservice and Licensed.
- This amounts to 6,600 calories per UK resident per year!

Were these reductions offset by increased consumption of high-caloric solid food? Unlikely.

- Household panel research finds no evidence for substitution from soft drinks to other sugary foods (Finkelstein et al, 2013).
- Best substitute for a sugary soft drink is a less sugary soft drink (especially if taste is similar).

Conclusion: The Levy Worked

But for reasons you may not have expected

UK SDIL led to 6.1 billion fewer calories being consumed every week (mainstream off-trade for Top 100 brands only)

- Catalyst of pre-existing trend towards low/zero sugar
- Massive, 26.5% reduction. By way of comparison, Mexico's sugar tax led to a reduction of just 2.7% (Aguilar et al, 2021)

More than 80% of reduction was due to reformulation of SSBs:

- Big implications for academics and policy: Supply-side responses are understudied yet hugely important!
- Tiered, pre-announced tax that can be avoided with levels below clearly and technically feasible target is highly effective

Comments Welcome

Thank you very much!

markus.gehrsitz@strath.ac.uk

UK Media as of 2014

Figure 11: Daily Mail Cover Stories



Back to Motivation

Descriptive Statistics

Table 1: Summary statistics—top 100 brands.

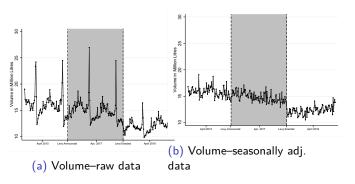
	Jul 2014-Feb 2016	Mar 2016-Mar 2018	Apr 2018-Jan 2020
Panel A: All Brands			
£ per Litre	1.00	1.03	1.13
Volume in Mio Litres	106.18	108.16	112.40
Calories in Billions	22.21	19.91	15.20
Panel B: Levied Brands			
£ per Litre	1.31	1.41	1.97
Volume in Mio Litres	16.04	14.88	12.08
Calories in Billions	6.89	6.41	5.25
Panel C: Reformulated Brands			
£ per Litre	1.40	1.39	1.44
Volume in Mio Litres	21.88	21.34	20.53
Calories in Billions	9.88	8.34	4.72
Panel D: Diet Brands			
£ per Litre	1.04	1.10	1.23
Volume in Mio Litres	20.65	22.96	27.89
Calories in Billions	0.13	0.17	0.22
Panel E: Non-Levied Brands			
£ per Litre	0.69	0.72	0.75
Volume in Mio Litres	47.62	48.97	51.90
Calories in Billions	5.31	4.99	5.01
Observations	84	109	95

Notes: All values are weighted by volume.

Back to Data Description

Seasonal Adjustment - Example: Levied Category

Figure 12: Seasonal adjustment-levied brand aggregates.

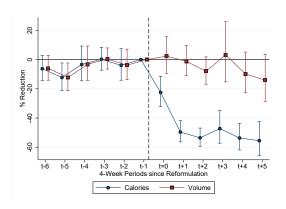


Notes: We seasonally adjust by regressing the outcome of interest on an indicator for whether a week contains the Christmas holiday, as well as first and second-order leads and lags; year-specific Christmas dummies for 2014, 2015, and 2016; indicators for weekly mean and maximum temperature; a continuous control for rainfall as well as a set of week-of-year fixed-effects. The residuals from this regression are shifted up by the mean of the raw variable.

Alternative Event-Study Specification

Classic Two-way fixed effects

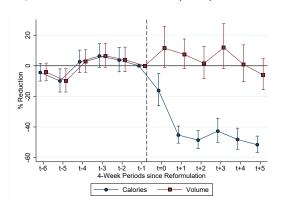
Figure 13: Classic Two-Way Fixed Effects Event-Study Estimation



Alternative Event-Study Specification

Levied brands as controls

Figure 14: Sun and Abraham (2020) Estimator



Nutritional Labels Before vs After



Event-Study - Raw Coefficients

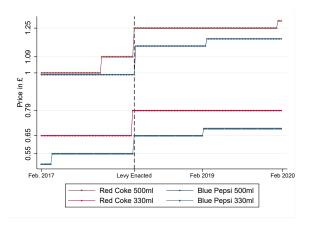
Table 2: Event-Study Results

	(1)	(2)	(3)	(4)
	(Log) Calories	(Log) Volume	Cal per 100m	£-Price per Litre
t - 6	-0.0588	-0.058	0.050	-0.004
	(0.046)	(0.046)	(0.068)	(0.013)
t-5	-0.107*	-0.108*	0.052	0.039**
	(0.060)	(0.061)	(0.117)	(0.014)
t-4	0.011	0.011	0.029	-0.021
	(0.049)	(0.050)	(0.090)	(0.016)
t-3	0.054	0.055	-0.018	-0.009
	(0.051)	(0.052)	(0.083)	(0.016)
t-2	0.027	0.027	-0.001	-0.004
	(0.059)	(0.059)	(0.079)	(0.014)
t = 0	-0.227***	0.055	-11.157***	0.005
	(0.057)	(0.054)	(0.888)	(0.012)
t+1	-0.636***	0.037	-22.593***	-0.041***
	(0.046)	(0.042)	(1.489)	(0.011)
t+2	-0.714***	-0.031	-22.860***	-0.007
	(0.045)	(0.041)	(1.476)	(0.011)
t + 3	-0.608***	-0.076	-22.736***	0.030
	(0.068)	(0.067)	(1.500)	(0.019)
t + 4	-0.699***	-0.036	-22.785***	-0.002
	(0.079)	(0.074)	(1.949)	(0.015)
$\geq t + 5$	-0.729***	-0.069	-23.483***	-0.009
	(0.107)	(0.109)	(.879)	(0.012)

Price Marked Packs (PMPs)

What are PMPs?

Figure 15: Pricing of price-marked packs (Colas)



Back to Results

What are PMPs?

Figure 16: PMP Example





Back to PMP Chart

Coke Bottle Take-Home Bottle Size over time

Figure 17: From 2l to 1.75l to 1.5l



Retailers' Margin Preservation

Key Performance Indicator: Profit on Return

$$POR = \frac{(P - VAT) - CostofGood}{(P - VAT)}$$
 (2)

Assume retail price is £1, VAT rate is 20%, and cost is 58p:

$$POR = (0.833 - 0.58)/0.833 = 30\%$$
 (3)

Now, assume manufacturer passes on 24p price increase. Also assume retailer, in turn, fully passes this on into retail price:

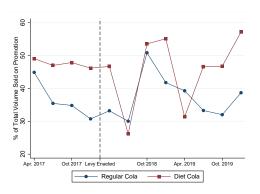
$$POR = (1.033 - 0.82)/1.033 = 20.6\%$$
 (4)

Retailer would need to set P =£1.41 (i.e. **overshift!**) to preserve POR of 30%

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Role of Promotions

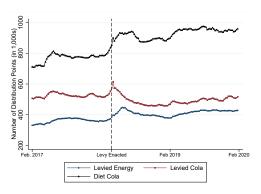
Figure 18: Promotion sales as percentage of total volume.



Notes: This figure shows the percentage of total sales volumes that was sold on promotion. Data on promotions are available at the fiscal quarterly level.

Role of Distribution

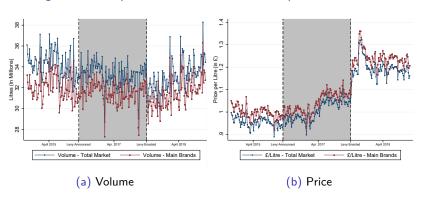
Figure 19: Number of scanning distribution points by beverage category.



Notes: This figure shows the number of distribution points—a proxy for how widely products are available—at a weekly level from February 2017 until January 2020.

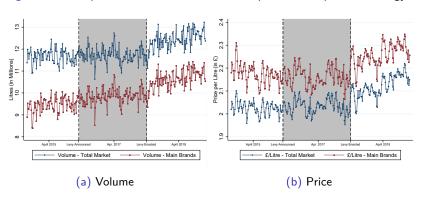
Market Coverage - Colas

Figure 20: Comparison of total market and top brands—colas.



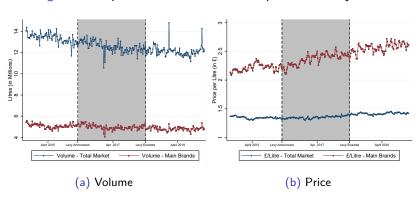
Market Coverage - Energy

Figure 21: Comparison of total market and top brands—sports & energy.



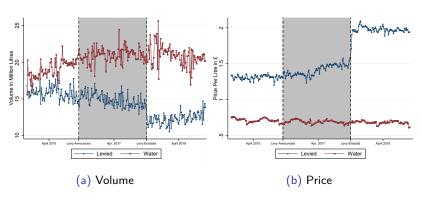
Fruit Juices - Role of Own brands

Figure 22: Top brands vs full-market comparison—fruit juice.



Water as Control Group

Figure 23: Water as a control group.



Notes: This figure shows trends in volume sales as well as price per litre for levied brands (blue circles) and levy-exempt water (red squares).

Total Calorie Reduction

Back of the Envelope Calculations

Assume that own-label brands all reformulated if they had to since they compete on price.

- Know their shares in all segments and whether they would fall under levy.
- Amounts to 165m calorie reduction per week
- Takes us to 93.1% of EPOS coverage

Remaining 6.9% are very small brands, many of which were levy-exempt

• Conservative assumption: No reformulation, no reduction

Back of the Envelope Calculations

Continental discounters and value stores

- According to household panel data: account for 1.5bn litres
- Assuming that discounters sell same product mix as main street, this implies another 0.9bn reduction

Foodservice and Licensed (e.g. on-trade) sells about 1.8bn litres p.a. (Britvic, 2019) which held stable over time.

- Any price increase much smaller in real terms, so assume no reduction in consumption for levied products
- For reformulating segments (e.g. OFC, fruit drinks) we assume 50% calorie reduction due to reformulation.
- Conservative estimate: Reduction of 1.2bn calories/week.

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