## Retrospective Merger Evaluation: GSK-Pfizer Consumer Health

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## Motivation

- Merging parties often argue efficiency defenses for a merger. There is surprisingly little affirmative checking whether efficiencies are realized and passed through.
- Merger within an oligopoly of two smaller companies is rarely examined. We consider a situation where there was a merger of two small companies. Here we have two among the top 5, where the top 5 have $95 \%$ market share.
- Debate on efficiency and pass through in merger context is enduring.
- Ex-post merger evaluations are, more generally, rare in developing countries, particularly with nascent competition authorities. We do so in the context of health care with evidence from the Philippines.


## Contribution

- We estimate the effect on prices of the products of the merging parties using standard diff-in-diff and event analysis and find that prices decrease post merger.
- We then use demand estimation methods to estimate the change in marginal costs that would rationalize the drop in prices; we also compute the effect on the prices of the competitors due to cost efficiency gain of the merging party
- A standard merger simulation follows demand estimation where the estimated parameters are used to back out marginal costs which are then assumed constant. The change in ownership matrix gives price predictions (which are higher by construction if MC is constant).
- Instead we use pre-merger period to estimate demand parameter and then use pre-merger and post merger price data to compute change in marginal costs of the merging parties.


## The Market

Consumer Health products represent $40 \%$ of the value of the entire pharmaceutical sector, about 1.73 Bn USD in 2020. In 2018, sales of Cough and Cold Remedies in the Philippines was worth an estimated 160 Mn USD where $94.4 \%$ is represented by only 5 firms.

Table 1: Market Shares, Product and Active Substance Counts in 2018

| Firm | Product | Prop Label | Non-Prop Label | Private Label | Active Substance | Share (\%) |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| United Lab | 23 | 18 | 0 | 5 | 18 | 67.90 |
| Pfizer | 4 | 4 | 0 | 0 | 4 | 8.34 |
| Sanofi Aventis | 2 | 2 | 0 | 0 | 2 | 7.19 |
| GSK | 3 | 3 | 0 | 0 | 2 | 6.02 |
| Pascual | 2 | 2 | 0 | 0 | 2 | 4.97 |
| Others (47) | 71 | 66 | 5 | 0 | 21 | 5.58 |
| Total | 105 | 95 | 5 | 5 | 49 | 100 |

Note: Table shows the largest firms, brands and active substances computed based on total values of sales in 2018

## The Market

Table 2: Market Share by Product Attribute, 2008-2018

| Attribute | mean | sd | $\min$ | $\max$ |
| :--- | :---: | :---: | :---: | :---: |
| Proprietary Label | 0.9957 | 0.0007 | 0.9941 | 0.9968 |
| Foreign | 0.2714 | 0.0329 | 0.2011 | 0.3530 |
| Combination INN | 0.5048 | 0.0349 | 0.4219 | 0.5852 |
| Solid Form | 0.6350 | 0.0335 | 0.5649 | 0.7294 |
| Flavored | 0.0794 | 0.0154 | 0.0478 | 0.1007 |

Note: Figures above are computed based on total sales value

## The Acquisition

Acquiring entity: GlaxoSmithKline Consumer Healthcare Holdings, Ltd. (GSK)
Acquired business: Pfizer Inc.'s Consumer Healthcare Buisness (Pfizer)
The Philippine Competition Commission was notified of the proposed purchase on 18 January 2019. After undergoing Phase 1 and Phase 2 reviews, the transaction was cleared on 27 June 2019.

Table 3: Products of Merging Parties in Cough and Cold Remedies

| FIRM | PRODUCT | ACTIVE SUBSTANCE | THERAPEUTIC CATEGORY | FORMS |
| :--- | :--- | :--- | :--- | :--- |
| Pfizer | Robitussin | Dextromethorphan+Guaifenesin | Expectorant, Antitussive | Capsule Soft Gel, Syrup |
|  | Robikids | Carbocisteine | Expectorant | Suspension |
|  | Loviscol | Carbocisteine | Expectorant | Capsule, Drops, Syrup |
|  | Dimetapp | Brompheniramine+Phenyleprine | Antihistamine, Decongestant | Syrup |
| GSK | Ambrolex | Ambroxol | Expectorant | Capsule, Drops, Syrup, Tablet |
|  | Sinecod | Butamirate | Antitussive | Coated Tablet, Syrup |
|  | Sinecough Expel | Ambroxol | Expectorant | Drops, Syrup, Tablet |

## Datasets

- IQVIA's Philippine Pharmaceutical Index (PPI) and Philippine Hospital Pharmaceutical Audit (PHPA), Q1 2008 to Q4 2020
- IQVIA's MIDAS World Review Pack (WRP) Database, Indonesia, Malaysia, Singapore, and Thailand, Q4 2009 to Q4 2021
Attributes (selected):
- Provides actual nationwide sales information per Stock Keeping Unit (SKU)
- Firm: Corporations, Manufacturers
- Channel: Retail, Hospital
- Drug: Product, Pack Description (Form, Strength, Size), Anatomical Therapeutic Class 3, New Form Code 3, Active Substance
- Measures: Revenue, Counting Unit and Dosage Unit
- Pre merger period of Q1 2008 to Q2 2019 (46 Qtrs) and post merger period of Q3 2019 to Q4 2020 (6 Qtrs)
- Product $j \in J$ is Corporation+Product+Active Substance+NFC, where $J=54$ Selection
e.g. PFIZER + ROBITUSSIN + GUAIFENESIN + LIQUID ORDINARY RELEASE SYRUP
- A Market $t$ is a country-quarter combination which has information on product $j$ 's Total revenue $r_{j t}$ and volume in Dosage units $q_{j t}$, used to compute Price $p_{j t}=r_{j h t} / q_{j t}$


## Reduced Form Merger Evaluation: Event Study

$$
\ln p_{j t}=\alpha_{j}+\gamma_{t}+\beta_{y}\left(M_{j t} \times \sum_{\substack{y=-9 \\ y \neq-1}}^{5} I\left(t-t^{*}=y\right)\right)+\sum_{q=1}^{3} \theta_{q} Q_{j t}+\varepsilon_{j t},
$$

## Reduced Form Merger Evaluation: Event Study

Std Ave Price, Control: Private Label, Cough and Cold


Std Ave Price, Control: Proprietary Label Analgesics


Std Ave Price, Control: Proprietary Label, Cough and Cold


Std Ave Price, Control: Hypertension Drugs


## Reduced Form Merger Evaluation: DD

$$
\begin{gathered}
\ln p_{j t}=\alpha_{j}+\gamma_{t}+\beta^{M}\left(M_{j t} \times P_{j t}\right)+\sigma X_{j t}+\varepsilon_{j t} \\
\ln p_{j t}=\alpha_{j}+\gamma_{t}+\beta^{G}\left(G S K_{j t} \times P_{j t}\right)+\beta^{\text {Pf }}\left(\text { Pfizer }_{j t} \times P_{j t}\right)+\sigma X_{j t}+\varepsilon_{j t}
\end{gathered}
$$

## Reduced Form Merger Evaluation: DD

Table 4: Merger Price Effect, Philippine Comparisons

|  | Cough \& Cold ${ }^{\text {a }}$ |  | Analgesics | Hypertension |
| :---: | :---: | :---: | :---: | :---: |
|  | Private Label | Proprietary Label | Proprietary Label | All |
| Standard Average Price |  |  |  |  |
| Aggregate Effect |  |  |  |  |
| $\mathrm{M} \times \mathrm{P}$ | $\begin{aligned} & 0.015^{* *} \\ & (0.007) \end{aligned}$ | $\begin{gathered} -0.035^{* * *} \\ (0.007) \end{gathered}$ | $\begin{gathered} -0.026^{* * *} \\ (0.010) \end{gathered}$ | $\begin{gathered} -0.029^{*} \\ (0.015) \end{gathered}$ |
| Separate Effects |  |  |  |  |
| GSK $\times$ P | $\begin{gathered} 0.035^{* * *} \\ (0.008) \end{gathered}$ | $\begin{aligned} & -0.015 \\ & (0.010) \end{aligned}$ | $\begin{aligned} & -0.007 \\ & (0.016) \end{aligned}$ | $\begin{gathered} 0.009 \\ (0.025) \end{gathered}$ |
| Pfizer $\times$ P | $\begin{gathered} 0.005 \\ (0.007) \end{gathered}$ | $\begin{gathered} -0.045^{* * *} \\ (0.008) \end{gathered}$ | $\begin{gathered} -0.036^{* * *} \\ (0.012) \end{gathered}$ | $\begin{gathered} -0.038^{* *} \\ (0.018) \end{gathered}$ |
| Stone Price Index, Q4 2017 weights |  |  |  |  |
| Aggregate Effect |  |  |  |  |
| $\mathrm{M} \times \mathrm{P}$ | $\begin{gathered} -0.062^{* * *} \\ (0.018) \end{gathered}$ | $\begin{gathered} -0.145^{*} \\ (0.080) \end{gathered}$ | $\begin{aligned} & -0.005 \\ & (0.059) \end{aligned}$ | $\begin{aligned} & -0.017 \\ & (0.013) \end{aligned}$ |
| Separate Effect |  |  |  |  |
| $G S K \times P$ | $\begin{gathered} -0.088^{* * *} \\ (0.021) \end{gathered}$ | $\begin{aligned} & -0.172 \\ & (0.124) \end{aligned}$ | $\begin{aligned} & -0.031 \\ & (0.095) \end{aligned}$ | $\begin{gathered} -0.044^{* *} \\ (0.022) \end{gathered}$ |
| Pfizer $\times$ P | $\begin{gathered} -0.049^{* *} \\ (0.019) \end{gathered}$ | $\begin{aligned} & -0.132 \\ & (0.093) \end{aligned}$ | $\begin{gathered} 0.008 \\ (0.070) \end{gathered}$ | $\begin{aligned} & -0.004 \\ & (0.015) \end{aligned}$ |
| Stone Price Index, Q3 2020 weights |  |  |  |  |
| Aggregate Effect |  |  |  |  |
| $\mathrm{M} \times \mathrm{P}$ | $\begin{gathered} 0.001 \\ (0.218) \end{gathered}$ | $\begin{gathered} -0.175^{*} \\ (0.100) \end{gathered}$ | $\begin{gathered} -0.245^{* * *} \\ (0.066) \end{gathered}$ | $\begin{gathered} -0.292^{* * *} \\ (0.035) \end{gathered}$ |
| Separate Effect |  |  |  |  |
| GSK $\times$ P | $\begin{gathered} 0.250 \\ (0.265) \end{gathered}$ | $\begin{aligned} & -0.074 \\ & (0.153) \end{aligned}$ | $\begin{aligned} & -0.003 \\ & (0.105) \end{aligned}$ | $\begin{aligned} & -0.044 \\ & (0.059) \end{aligned}$ |
| Pfizer $\times$ P | $\begin{aligned} & -0.123 \\ & (0.230) \\ & \hline \end{aligned}$ | $\begin{gathered} -0.299^{* * *} \\ (0.115) \\ \hline \end{gathered}$ | $\begin{gathered} -0.369^{* * *} \\ (0.078) \\ \hline \end{gathered}$ | $\begin{gathered} -0.416^{* * *} \\ (0.042) \\ \hline \end{gathered}$ |
| Product FE | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Time FE | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Observations | 132 | 327 | 477 | 1,420 |

Note: ${ }^{a}$ Products with the same active substance as GSK and Pfizer products;

## Retrospective Merger Evaluation, Model Based

1. Merger Simulation. Reflecting the ownership structure after the acquisition, holding marginal cost and demand parameters fixed, new equilibrium prices can be calculated using ex-ante data.
2. Efficiency Calculation. Using ex-post data and holding demand parameters fixed, calculate the change in marginal cost by first finding the costs associated with actual observed prices such that the difference between model predicted equilibrium prices and actual observed prices is minimized, then compare with pre-acquisition marginal costs.

$$
\Delta \mathbf{c}=\left(\mathbf{c}_{\text {Post }} / \mathbf{c}_{\text {Pre }}\right)-1
$$

## Parameter Estimates

Table 5: Demand and Cost Parameter Estimates

|  | $\frac{\text { OLS }}{\text { Logit }}$ | 2SLS |  | Random Coefficient Logit |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Logit | Nested Logit | Demand Side |  | $\underline{\text { Cost Side }}$ |
|  |  |  |  | $\bar{\beta}$ | $\sigma_{\beta}$ |  |
| Constant | $\begin{gathered} -8.186^{* * *} \\ (0.207) \end{gathered}$ | $\begin{gathered} -7.258^{* * *} \\ (0.356) \end{gathered}$ | $\begin{gathered} \hline-3.649^{* * *} \\ (0.205) \end{gathered}$ | $\begin{gathered} 6.5025^{* * *} \\ (0.835) \end{gathered}$ | $\begin{aligned} & 0.0000 \\ & (0.026) \end{aligned}$ | $\begin{gathered} -0.0270 \\ (0.022) \end{gathered}$ |
| Price | $\begin{gathered} 10.518^{* * *} \\ (1.715) \end{gathered}$ | $\begin{gathered} -15.662^{*} \\ (8.121) \end{gathered}$ | $\begin{gathered} -4.134^{* *} \\ (1.647) \end{gathered}$ | $\begin{gathered} -23.609^{* * *} \\ (0.085) \end{gathered}$ | $\begin{gathered} 13.213^{* * *} \\ (0.074) \end{gathered}$ |  |
| Subgroup ( $\sigma_{1}$ ) |  |  | $\begin{gathered} 0.851^{* * *} \\ (0.043) \end{gathered}$ |  |  |  |
| Group ( $\sigma_{2}$ ) |  |  | $\begin{gathered} 0.844^{* * *} \\ (0.045) \end{gathered}$ |  |  |  |
| No. of Packs | $\begin{gathered} 0.615^{* * *} \\ (0.051) \end{gathered}$ | $\begin{gathered} 0.541^{* * *} \\ (0.059) \end{gathered}$ | $\begin{gathered} 0.091^{* * *} \\ (0.023) \end{gathered}$ | $\begin{gathered} 0.494^{* * *} \\ (0.021) \end{gathered}$ |  | $\begin{gathered} -0.0029 \\ (0.014) \end{gathered}$ |
| No. of INN ${ }^{\text {a }}$ | 0.0439 | 0.0472 | -0.0263 | 0.8447*** |  |  |
|  | 0.1241 | 0.1243 | 0.0543 | (0.224) |  |  |
| Foreign ${ }^{\text {a }}$ | $\begin{gathered} -0.8048^{* * *} \\ 0.2692 \end{gathered}$ | $\begin{gathered} -0.8351^{* * *} \\ 0.2641 \end{gathered}$ | $\begin{gathered} -0.1869^{*} \\ 0.129 \end{gathered}$ | $\begin{gathered} -3.743^{* * *} \\ (1.072) \end{gathered}$ | $\begin{gathered} 3.469^{* * *} \\ (0.030) \end{gathered}$ |  |
| Solid Form ${ }^{\text {a }}$ | $\begin{gathered} -0.1493 \\ 0.2588 \end{gathered}$ | $\begin{gathered} -0.0165 \\ 0.2723 \end{gathered}$ | $\begin{gathered} 0.822^{* * *} \\ 0.134 \end{gathered}$ | $\begin{gathered} -3.586^{* * *} \\ (0.746) \end{gathered}$ | $\begin{gathered} 5.836^{* * *} \\ (0.052) \end{gathered}$ |  |
| Flavored ${ }^{\text {a }}$ | $\begin{gathered} -0.4672 \\ 0.4508 \end{gathered}$ | $\begin{gathered} -0.4016 \\ 0.4168 \end{gathered}$ | $\begin{gathered} -0.1782 \\ 0.1925 \end{gathered}$ | $\begin{gathered} 4.877^{* * *} \\ (2.279) \end{gathered}$ |  |  |
| PH Exchange rate |  |  |  |  |  | $\begin{aligned} & 1.010^{* * *} \\ & (0.0003) \\ & \hline \hline \end{aligned}$ |

Notes: 1,985 observations were used from the period Q4 2009 to Q1 2019. Demand side specifications include 38 quarter fixed effects and 54 product fixed effects. Supply side specification includes 18 molecule fixed effects and controls for country specific currency cross rates in USD. [a] Mean utility coefficients of time invariant variables are computed via second stage minimum distance projection of estimated product fixed effects on characteristics.

## Mark-ups and Marginal Cost

Table 6: Price Elasticity and Markups

| Product level, Price Elasticity | mean | sd | min | max |
| :---: | :---: | :---: | :---: | :---: |
| Own price elasticity | -3.0948 | 1.3951 | -14.9117 | -0.1754 |
| Cross price elasticity | 0.0125 | 0.0412 | $4.1136^{-10}$ | 1.4705 |
| Markups ( $p-c$ )/p | \% (Pre) | \% (Post) |  |  |
| GSK | 26.7490 | 28.7338 |  |  |
| Pfizer | 30.5731 | 32.2263 |  |  |
| Pascual | 60.5669 | 60.8475 |  |  |
| Sanofi Aventis | 27.2035 | 26.2562 |  |  |
| United Lab | 75.2394 | 75.5907 |  |  |
| Foreign | 33.4501 | 34.0857 |  |  |
| Local | 89.3802 | 89.7838 |  |  |

## Pre and Post Merger Costs



## Pre and Post Mark ups



## Comparison of Outcomes

Table 7: Comparison of Predicted Outcomes

|  | Merger Simulation, |  | Estimated mc |  |
| :--- | ---: | ---: | ---: | ---: |
| Product Line | Using Pre-acquistion Data |  | mc |  |
|  | Using Post-acquistion Data |  |  |  |

## Merger Specific Efficiency Gain

We use marginal costs in the pre-merger periods, Q4 2017-Q3 2018, and post-merger marginal costs in Q4 2019-Q3 2020 to estimate the effect of the merger via diff-in-diff.

Table 8: Efficiency from the Merger via Marginal Cost

|  | $(1)$ | $(2)$ |
| :--- | :---: | :---: |
| GSK |  | $-2.568^{* * *}$ |
| Pfizer |  | $-2.279^{* * *}$ |
| Combined | $-2.376^{* * *}$ |  |
| Obs | 416 | 416 |
| R-squared | 0.997 | 0.997 |

${ }^{1}$ Coefficients are adjusted by $100^{*}$ (beta/avg.mc),
avg.mc $=0.1$.

## Alternative algorithms

Alternative ways to estimate post-merger marginal costs:

1. Benchmark post-merger prices using DiD model (a combined reduction of $-2.9 \%$, or $+0.9 \%$ for GSK and $-3.8 \%$ for Pfizer). Determine the change in MC associated with equilibrium market prices that matches the predicted prices of the DiD model.
2. Assume parameters estimated from the demand model remain unchanged. Using observed prices post-merger, directly back out the marginal costs.

Table 9: Estimated \% $\Delta \mathrm{MC}$ drop from alternatives algorithms

|  | Post Merger Prices |  |
| :--- | :---: | :---: |
| Product Line | Actual observed | DiD prediction |
| GSK | -2.11 | -1.05 |
| Pfizer | -2.60 | -7.28 |
| Combined | -2.40 | -4.95 |
| Non-merging | -0.16 | 0 |

Thank you.

## Marginal Cost Evolution

\% change of MC compared to corresponding pre-merger quarters


Using actual observed prices


Using DiD predicted prices

## Marginal Cost Evolution

Evolution of MC relative to values in t-1 (Q3 2018)


Using actual observed prices


Using DiD predicted prices

## Marginal Cost Evolution

Evolution of MC relative to values in t-1 (Q3 2018), Top 5 firms


Using actual observed prices


Using DiD predicted prices

## Market Shares by Active Substance

Table 10: Market Shares of Top 4 Firms in 2018 by Active Substance shared with GSK or Pfizer

|  | Carbocisteine | Ambroxol | Butamirate | Dextromethorphan <br> +Guaifenesin | Guaifenesin | Brompheniramine <br> +Phenylephrine | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| United <br> Lab | 18.52 | 2.33 |  |  |  |  | 20.85 |
| Pfizer | 0.92 |  |  |  |  |  |  |
| Sanofi <br> Aventis <br> GSK |  | 6.61 |  |  |  |  |  |
| Total | 19.44 | 10.15 | 4.87 |  |  |  | 8.24 |

Note: Figures above are computed based on sales value in 2018

## Product Set Selection

Table 11: Product Set Average Shares (2008-2018)

| Count | Product ID | Share | CumSum | Count | Product ID | Share | CumSum |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 160 | 0.2085 | 0.2085 | 28 | 22 | 0.0080 | 0.8561 |
| 2 | 138 | 0.1076 | 0.3162 | 29 | 84 | 0.0076 | 0.8637 |
| 3 | 168 | 0.0808 | 0.3970 | 30 | 171 | 0.0074 | 0.8711 |
| 4 | 173 | 0.0372 | 0.4341 | 31 | 159 | 0.0073 | 0.8785 |
| 5 | 77 | 0.0323 | 0.4665 | 32 | 118 | 0.0057 | 0.8842 |
| 6 | 178 | 0.0317 | 0.4982 | 33 | 20 | 0.0054 | 0.8895 |
| 7 | 89 | 0.0283 | 0.5264 | 34 | 24 | 0.0051 | 0.8946 |
| 8 | 143 | 0.0271 | 0.5536 | 35 | 114 | 0.0047 | 0.8993 |
| 9 | 78 | 0.0265 | 0.5800 | 36 | 109 | 0.0046 | 0.9040 |
| 10 | 161 | 0.0246 | 0.6046 | 37 | 86 | 0.0046 | 0.9086 |
| 11 | 150 | 0.0243 | 0.6289 | 38 | 76 | 0.0046 | 0.9132 |
| 12 | 185 | 0.0188 | 0.6477 | 39 | 153 | 0.0044 | 0.9176 |
| 13 | 149 | 0.0180 | 0.6657 | 40 | 112 | 0.0043 | 0.9219 |
| 14 | 44 | 0.0175 | 0.6833 | 41 | 155 | 0.0041 | 0.9260 |
| 15 | 144 | 0.0175 | 0.7008 | 42 | 116 | 0.0040 | 0.9300 |
| 16 | 91 | 0.0172 | 0.7180 | 43 | 172 | 0.0039 | 0.9339 |
| 17 | 23 | 0.0169 | 0.7349 | 44 | 108 | 0.0039 | 0.9378 |
| 18 | 163 | 0.0144 | 0.7493 | 45 | 179 | 0.0038 | 0.9417 |
| 19 | 90 | 0.0129 | 0.7621 | 46 | 133 | 0.0034 | 0.9450 |
| 20 | 170 | 0.0129 | 0.7750 | 47 | 88 | 0.0031 | 0.9482 |
| 21 | 162 | 0.0121 | 0.7871 | 48 | 145 | 0.0031 | 0.9512 |
| 22 | 146 | 0.0113 | 0.7984 | 49 | 68 | 0.0031 | 0.9543 |
| 23 | 9 | 0.0104 | 0.8088 | 50 | 115 | 0.0028 | 0.9571 |
| 24 | 82 | 0.0102 | 0.8190 | 51 | 8 | 0.0024 | 0.9595 |
| 25 | 87 | 0.0102 | 0.8292 | 52 | 85 | 0.0024 | 0.9618 |
| 26 | 106 | 0.0098 | 0.8391 | 53 | 113 | 0.0023 | 0.9641 |
| 27 | 117 | 0.0090 | 0.8481 | 54 | 70 | 0.0022 | 0.9663 |

## Additional Demand Estimation Results

Table 12: Summary of Between and Within Variation of Variables

| Variable | Description | mean | min | max | $s_{O}^{2}$ | $s_{B}^{2}$ | $s_{W}^{2}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Share variables |  |  |  |  |  |  |  |
| $s_{j t}$ | Share of product $j$ | 0.003 | 0.000 | 0.066 | 0.006 | 0.006 | 0.002 |
| $s_{0 t}$ | Share of outside good | 0.829 | 0.767 | 0.903 | 0.032 | 0.002 | 0.032 |
| $\ln \left(s_{j t} / s_{0 t}\right)$ | Dependent variable | -6.468 | -18.445 | -2.455 | 1.614 | 1.362 | 0.953 |
| $\ln \left(s_{j t} / s_{h g}\right)$ | Within subgroup log share | -1.236 | -15.953 | 0.000 | 1.522 | 1.430 | 0.666 |
| $\ln \left(s_{h g} / s_{g}\right)$ | Within group log share | -2.523 | -13.482 | -0.418 | 1.333 | 1.262 | 0.654 |
| Product characteristics |  |  |  |  |  |  |  |
| $p_{j t}$ | Price (USD) per dose | 0.139 | 0.008 | 0.792 | 0.095 | 0.093 | 0.015 |
| $\chi_{1 j t}$ | \# of pack varieties | 1.811 | 1.000 | 12.000 | 1.231 | 1.157 | 0.405 |
| $x_{2 j t}$ | \# of molecules | 1.769 | 1.000 | 11.000 | 1.494 | 1.497 | 0.000 |
| $x_{3 j t}$ | Dummy (Foreign/Local) | 0.477 | 0.000 | 1.000 | 0.500 | 0.503 | 0.000 |
| $x_{4 j t}$ | Dummy (Flavor/No Flavor) | 0.096 | 0.000 | 1.000 | 0.294 | 0.293 | 0.000 |
| $\times_{5 j t}$ | Dummy (Solid/Not Solid) | 0.413 | 0.000 | 1.000 | 0.492 | 0.499 | 0.000 |
| Instruments |  |  |  |  |  |  |  |
| $z_{1 t}$ | Exchange rate | 0.022 | 0.019 | 0.024 | 0.002 | 0.000 | 0.002 |
| $z_{2 j t}$ | \# of products (other firms) | 92.057 | 62.000 | 134.000 | 16.009 | 12.682 | 9.988 |
| $z_{3 j t}$ | \# of molecules (other firms) | 64.001 | 43.000 | 105.000 | 13.458 | 10.247 | 8.862 |
| $z_{4 j t}$ | \# of molecules (other firms, within same group) | 5.698 | 0.000 | 23.000 | 6.809 | 6.726 | 1.925 |
| $z_{5 j t}$ | \# of molecules (other drugs by same firm, within same group) | 24.102 | 11.000 | 42.000 | 5.794 | 4.803 | 3.216 |
| $z_{6 j t}$ | \# of brands (other firms, within same group) | 26.502 | 11.000 | 50.000 | 9.337 | 7.038 | 6.179 |
| $z_{7 j t}$ | Price of product $j$ in other ASEAN countries | 0.089 | 0.001 | 0.770 | 0.097 | 0.086 | 0.044 |

## Appendix B. Additional Demand Estimation Results contd

Table 13: Logit and Nested Logit, First-Stage Estimates

| Number of products (comp) | Logit | Nested Logit |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | $\begin{gathered} \log \left(p_{j}\right) \\ 0.002^{* * *} \end{gathered}$ <br> (0.0003) | $\log \left(p_{j}\right)$ | $\log \left(s_{j i h g}\right)$ | $\log \left(s_{h g}\right)$ |
|  |  |  |  |  |
| Number of mol (comp) | $-0.001{ }^{* * *}$ |  |  |  |
|  | (0.0002) |  |  |  |
| Number of brand (k not j, group) |  | $0.002^{* * *}$ | -0.014 | 0.159*** |
|  |  | (0.001) | (0.029) | (0.029) |
| Number of pack (knot j, group) |  | $-0.002^{* * *}$ | $-0.091^{* * *}$ | 0.043*** |
|  |  | (0.0002) | (0.014) | (0.014) |
| Number of mol (knot j, group) |  | 0.001 *** | 0.042*** | $-0.055^{* * *}$ |
|  |  | (0.0002) | (0.011) | (0.011) |
| Number of brand (comp, group) |  | 0.00005 | -0.001 | 0.045*** |
|  |  | (0.0003) | (0.014) | (0.014) |
| ASEAN price | 0.045*** | 0.070*** | -0.425 | $-1.115^{* * *}$ |
|  | (0.007) | (0.007) | (0.408) | (0.409) |
| F-test excluded instruments | 33.2274 | 23.6265 | 11.6272 | 11.3548 |

[^0] specifications include 38 market fixed effects and 54 product fixed effects.


[^0]:    Notes: 1,985 observations were used from the period Q4 2009 to Q1 2019. Demand side

