

## TOPICS IN WINE ECONOMICS<sup>†</sup>

# Wine Retail Price Dispersion in the United States: Searching for Expensive Wines?

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Like other markets in which deviation from Jevons's "law of one price" is the norm rather than the exception, the retail wine market in the United States is characterized by enormous price dispersions. For instance, in our data retail prices for 2005 *Chateau Latour* range from \$695 in a Petaluma, California, wine store to \$2,000 in a wine store in Champaign, Illinois. Similarly, at the lower end of the price distribution, the observed retail price of 2007 *Yellowtail Merlot* ranges from \$4.99 in Buffalo, New York, to \$9.99 in Jersey City, New Jersey. Price dispersion in the wine market can be caused by various factors, such as differences in production and distribution cost, differences in price elasticities of demand, or different market regulations and structures.

Since the ratification of the 21st Amendment repealing Prohibition, the US wine market has been primarily regulated at the state level, more or less impairing or effectively abolishing competition between wine retail outlets. In addition to the federal wine tax, wine is levied by state-specific wine and sales taxes. Eighteen states maintain a monopoly over the wholesale and retail sales of wine; others restrict the sales of wine to certain outlets and/or certain times, or do not allow the payment for wine purchases

with credit cards. Many states prohibit direct wine shipments from out-of-state producers and retailers, while others even prohibit in-state producers and retailers to ship wine to consumers. Price differences between states or counties are thus not surprising. In this paper we examine whether state- or county-specific effects fully explain the observed price dispersion or if price variations remain, even after controlling for location differences. If so, is the degree of price dispersion identical across all price brackets, or does the dispersion for expensive wines reflect greater returns to search?

A large body of information-theoretic literature suggests that markets, even for standardized products, may exhibit considerable price dispersion. Following George J. Stigler's (1961) paper, several authors model how equilibrium price dispersion can arise as a result of heterogeneous information (e.g., Steven Salop and Joseph E. Stiglitz 1977, 1982; Jennifer F. Reinganum 1979; Hal R. Varian 1980; Kenneth Burdett and Kenneth L. Judd 1983; John A. Carlson and R. Preston McAfee 1983; and Dale O. Stahl II 1989). In general, price dispersion can persist in equilibrium if obtaining information is costly (through, for example, search costs) and some fraction of consumers chooses to be uninformed.

A variety of empirical studies have explicitly examined the association between consumer search and price dispersion for homogenous goods. John W. Pratt, David A. Wise, and Richard Zeckhauser (1979) examine price dispersions for 39 consumer goods in the Boston area and report coefficients of variation (CV) for the product prices between 4 and 71 percent. They also find that the price dispersion substantially increases with the average price of the good, suggesting that the search cost for expensive items is higher. This may be explained by the fact that expensive products are purchased less frequently, reducing the incentive of a

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buyer to search. Bev Dahlby and Douglas S. West (1986) find a CV of 18 percent for auto insurance policies in Alberta. After ruling out quality or cost differences, they conclude that this price dispersion is almost exclusively due to costly consumer search. Alan T. Sorenson (2000) examines the retail prices of pharmacies in two geographically distinct markets and finds a CV of 22 percent. While at most one-third of the observed price dispersion is due to pharmacy heterogeneity, most is due to costly search. Sorenson also finds that frequently purchased prescriptions exhibit lower price variation.

Most relevant for our study is the hypothesis that the Internet and the emergence of online markets substantially lower search cost resulting in lower price dispersion (e.g., J. Yannis Bakos 1997). Xing Pan, Brian T. Ratchford, and Venkatesh Shankar (2002) analyze the price dispersion of 581 goods in 8 product categories in online markets. After controlling for sellers' heterogeneity and especially service quality, however, they find online price dispersion to be substantial and persistent. Erik K. Clemons, Il-Horn Hann, and Lorin M. Hitt (2002) report similar results for the market of airline tickets sold by online travel agents. Kathy Baylis and Jeffrey M. Perloff (2002) analyze Internet prices of a specific type of digital camera and a flatbed scanner over a 14-week period, and also find significant price dispersion, which even increases when controlling for service quality. In contrast to Varian's (1980) model of mixed strategies, they find a pure-strategies equilibrium, with high-price firms and low-price firms remaining fixed in the overall ranking over time. They conclude that information costs (the time taken to negotiate the website to discover stock and, to some extent, price information) are an important determinant of online price dispersion, and that firms may discriminate among consumers based on their knowledge, search costs, or patience.

Because a high degree of price dispersion indicates large potential gains to search by consumers, such dispersion may also suggest that the market in question is inefficient with regard to information. Empirical research has shown that consumer search in most cases stops before full information is obtained; sometimes no search takes place at all (Ratchford 2009). Given that search is costly, however, the optimum search point is reached when marginal

search cost equals its marginal benefit. Ratchford and Narasimhan Srinivasan (1993), Edward J. Fox and Stephen J. Hoch (2005), and Dinesh K. Gauri, K. Sudhir, and Debabrata Talukdar (2008) provide empirical evidence that is consistent with this normative rule.

Given that the search cost is essentially fixed per wine and independent of its price (e.g., searching a website), it is possible that search is more profitable for expensive wines, resulting in smaller price dispersion with increasing average prices. On the other hand, less expensive wines face a stiffer competition from close substitutes than expensive wines do. In contrast to a \$200 wine, when a consumer shops for a \$5 wine the brand and vintage are likely to be of less importance. Monopoly pricing power may therefore increase with price, potentially leading to a price dispersion that increases with a wine's average price. Alternatively, learning through experience may play a role and lead to the same dispersion-price relationship. Low-price wines sell at much higher quantities than high-end wines. Information about quality and prices of lower-tier wines may thus more easily penetrate the market (for "learning-by-buying" and "word-of-mouth," see Ratchford 2009).

In this analysis, we draw on a large database of wine retail prices to examine the relationship between price level and price dispersion. We first examine the role of local characteristics such as the number of retail wine establishments, per capita income, and local demographics on wine prices. We control for the regulatory environment by using state fixed effects. After also controlling for wine-vintage fixed effects, we then examine whether the residual variation in prices is related to the wine's average price. In general, we find a significant and positive relationship between residual variation in prices and (adjusted) price levels.

## I. Data and Descriptive Statistics

We use wine retail prices from 2006 to 2008 provided by wine-searcher.com, an Internet wine price search site on which wine retail outlets worldwide can post prices of their wines. For sellers in the United States, wine-searcher.com currently lists approximately 2.5 million prices posted by about 6,300 wine stores. Since many wines are available only in a few stores, we restrict our analysis to 186 wine brands of

TABLE 1—DESCRIPTIVE STATISTICS ON RETAIL WINE PRICES

| Sample               | Avg. mean price | Avg. coefficient of variation | Avg. <i>N</i> per wine | Number of wines |
|----------------------|-----------------|-------------------------------|------------------------|-----------------|
| Full sample          |                 |                               |                        |                 |
| Red                  | \$80.25         | 0.2495                        | 984.45                 | 136             |
| White                | \$27.84         | 0.1925                        | 746.32                 | 50              |
| United States        |                 |                               |                        |                 |
| Red                  | \$45.61         | 0.2002                        | 914.41                 | 66              |
| White                | \$15.17         | 0.1814                        | 746.84                 | 31              |
| France               |                 |                               |                        |                 |
| Red                  | \$148.64        | 0.3492                        | 1,173.49               | 47              |
| White                | \$130.53        | 0.3732                        | 689.33                 | 6               |
| Other                |                 |                               |                        |                 |
| Red                  | \$39.87         | 0.1874                        | 799.13                 | 23              |
| White                | \$10.66         | 0.1358                        | 771.38                 | 13              |
| Average price < \$15 |                 |                               |                        |                 |
| Red                  | \$8.50          | 0.1668                        | 661.92                 | 36              |
| White                | \$8.71          | 0.1668                        | 683.97                 | 29              |
| Average price < \$50 |                 |                               |                        |                 |
| Red                  | \$28.34         | 0.2576                        | 842.47                 | 32              |
| White                | \$22.83         | 0.1665                        | 883.69                 | 16              |
| Average price ≥ \$50 |                 |                               |                        |                 |
| Red                  | \$142.65        | 0.2895                        | 1,222.02               | 68              |
| White                | \$154.83        | 0.4099                        | 668.4                  | 5               |

Source: Authors' calculations using data from wine-searcher.com. Observations are from 2006–2008, measuring prices of nonvintage and vintage wines from the 1998–2007 vintages.

various vintages. For all but one of these wines we observe well over 200 prices, and for many we observe more than 1,000 prices.<sup>1</sup> Overall, our sample contains approximately 106,000 prices on red and white wines. In Table 1 we report some basic descriptive statistics on price levels and price dispersion. Most of the wines in our sample are produced in the United States and two-thirds of them are red. We observe substantial differences in price dispersion, measured by the coefficient of variation. Compared to the results of other empirical analyses, the overall price dispersion of 23.4 percent is rather

high. It is higher for red than for white wines and higher for French wines compared to domestic wines and other imports (mainly from Australia and Italy). Also, expensive wines exhibit higher price dispersion than do wines in lower price brackets, suggesting the dominance of the substitution effect or learning from buying over search cost hypotheses.

## II. Determinants of Wine Prices

To examine how local market characteristics affect wine prices, we estimate the equation

$$\begin{aligned}
 (1) \quad \log(p_{ivcsy}) = & \beta_0 + \beta_1 E_{cy} + \beta_2 I_c \\
 & + \beta_3 W_c + \beta_4 A_c + \beta_5 O_{ivy} \\
 & + \beta_6 NV_i + \theta_y + \delta_s \\
 & + \lambda_{iv} + \varepsilon_{ivcsy},
 \end{aligned}$$

where  $i$  indicates wine,  $v$  indicates vintage,  $c$  indicates county,  $s$  indicates state, and  $y$  indicates year of price posting. The variable  $E$  is the number of retail wine establishments in county

<sup>1</sup> The data contain observations for sizes in addition to the standard 750ml bottle. We have dropped all observations for nonstandard sizes. In addition, for each wine we have dropped the 5 percent lowest and 5 percent highest observed prices, to be sure that we were not capturing (mis)labeled case prices or other measurement issues. We have also dropped any observations in which the description indicated that the bottle was damaged or irregular in any way. For wines with both vintage and nonvintage prices reported, we dropped any nonvintage prices when these constituted less than 25 percent of the total number of observations for that wine. We also eliminated from the data rosé, sparkling, and fortified wines.

TABLE 2—DETERMINANTS OF WINE PRICES

| Variable   | Red                 |                     |                         | White               |                     |                     |
|--|---------------------|---------------------|-------------------------|---------------------|---------------------|---------------------|
|  | (1)                 | (2)                 | (3)                     | (4)                 | (5)                 | (6)                 |
| Number of wine retailers per<br>2000 county population   | 0.0031<br>(0.0002)  | 0.0002<br>(0.0001)  | 0.0002<br>( $<0.0001$ ) | 0.0023<br>(0.0004)  | -0.0002<br>(0.0001) | -0.0001<br>(0.0001) |
| Log per capita income (2000)<br>in county                | 0.1568<br>(0.0011)  | -0.0300<br>(0.0068) | -0.0083<br>(0.0007)     | 0.1423<br>(0.0386)  | -0.0208<br>(0.0099) | -0.0107<br>(0.0079) |
| White share of county population<br>(2000)               | -0.0243<br>(0.0073) | -0.0017<br>(0.0085) | -0.0189<br>(0.0060)     | -0.2334<br>(0.0515) | 0.0214<br>(0.0129)  | -0.0066<br>(0.0101) |
| Share of county population that is<br>25 or older (2000) | 0.0247<br>(0.0249)  | 0.1714<br>(0.0393)  | 0.1987<br>(0.0282)      | 1.4587<br>(0.2307)  | 0.2767<br>(0.0608)  | 0.2412<br>(0.0479)  |
| Wine age (nonvintage = 0)                                |                     | 0.0075<br>(0.0008)  | 0.1411<br>(0.0034)      |                     | 0.0231<br>(0.0023)  | 0.0533<br>(0.0042)  |
| Nonvintage   |                     | -0.0573<br>(0.0042) |                         |                     | -0.0152<br>(0.0067) |                     |
| Year fixed effects                                       | X                   | X                   | X                       | X                   | X                   | X                   |
| State fixed effects                                      | X                   | X                   | X                       | X                   | X                   | X                   |
| Wine fixed effects                                       |                     | X                   |                         |                     | X                   |                     |
| Wine $\times$ vintage fixed effects                      |                     |                     | X                       |                     |                     | X                   |
| $R^2$  | 0.07                | 0.95                | 0.98                    | 0.13                | 0.94                | 0.97                |
| Observations   |                     | 82,698              |                         |                     | 23,919              |                     |

Note: Dependent variable is log price. Estimated via OLS. Heteroskedasticity-consistent standard errors are in parentheses.

Source: Authors' calculations using data from wine-searcher.com. Observations are from 2006–2008, measuring prices of non-vintage and vintage wines from the 1998–2007 vintages.

$c$  in year  $y$  divided by the county population in 2000, taken from the county business patterns data of the United States Census Bureau.  $I$  is per capita income in the county in 2000,  $W$  is the white share of the population in the county in 2000,  $A$  is the share of the county population in 2000 that is 25 or over (the population most likely to drink wine),  $O$  is how old the wine is in year  $y$  (nonvintage wines are coded to zero),  $NV$  is an indicator for nonvintage wines,  $\theta$  is a year fixed effect,  $\delta$  is a state fixed effect (capturing differences in state regulations),  $\lambda$  is a wine  $\times$  vintage fixed effect, and  $\varepsilon$  is the idiosyncratic term. In some specifications, we use only simple wine fixed effects without letting the coefficient vary across vintages.

The results of estimating variants of equation (1) are presented in Table 2. The first three columns contain results for red wine and the last three contain results for white wine. In columns 1 and 4 we constrain the  $\lambda$ s as well as the coefficient wine age and nonvintage to be equal to zero. It is clear from both columns that prices vary with local market conditions, even with our sample drawn from sellers who list their prices

on the Internet. Local market conditions explain only between 7 (red) and 13 (white) percent of the variation in prices, however. This is not surprising—in this regression we are treating all wines the same, regardless of where or by whom they were produced.

In columns 2 and 5 we add fixed effects for each wine to the analysis, but constrain these to be equal across vintages. The model now accounts for 95 percent of the variation in log prices—clearly the majority of variation in wine prices comes from differences in origin and quality. The coefficients on income, the share of whites in the population, and age change somewhat, suggesting that different wines are sold in different locations. In columns 3 and 6, we allow for a full set of wine  $\times$  vintage interactions. The results are qualitatively similar to those in column 2.

### III. The Relationship between Price and Variance

Our fundamental research question is whether there is a relationship between residual price variation and price level. In Table 3, we report the slope coefficients from a regression of the

TABLE 3—RELATIONSHIP BETWEEN RESIDUAL PRICE DISPERSION AND AVERAGE PRICE

| Sample     | Red                |          | White              |          |
|------------|--------------------|----------|--------------------|----------|
|            | Coefficient        | <i>N</i> | Coefficient        | <i>N</i> |
| All        | 0.0024<br>(0.0010) | 1,117    | 0.0064<br>(0.0020) | 398      |
| Vintage    | 0.0025<br>(0.0010) | 1,056    | 0.0062<br>(0.0020) | 352      |
| Nonvintage | 0.0291<br>(0.0151) | 61       | 0.0171<br>(0.0133) | 46       |

*Notes:* Each coefficient comes from a separate regression. We regress the average squared residuals for each wine  $\times$  vintage combination on the fixed effects for those combinations. These are taken from columns 2 and 6 of Table 2. Heteroskedasticity-consistent standard errors in parentheses.

*Source:* Authors' calculations using data from wine-searcher.com. Observations are from 2006–2008, measuring prices of nonvintage and vintage wines from the 1998–2007 vintages.

average squared residual on the fixed effect for each wine  $\times$  vintage combination, both taken from columns 3 and 6 of Table 2 for red and white wines, respectively. That is, we are estimating

$$(2) \quad \bar{e}_{iv}^2 = \phi + \varphi \hat{\lambda}_{iv} + \xi_{iv},$$

where  $e$  are the residuals from the estimation of equation (1). Here we find that, overall, there is a positive relationship between residual variation in prices and their level. To put the magnitude of the coefficient in context, the average value of the dependent variable for red wines (that is, the average mean squared residual) is 0.0287. Thus, the estimated coefficient on the full sample of 1,117 wine  $\times$  vintage combinations is about one-tenth of this average. For white wines, the average mean squared residual is 0.0209 and the estimated coefficient for the full sample is about three-tenths of this (0.0064). For both red and white wines, we find a stronger statistical relationship between dispersion and average price for vintage wines than for nonvintage wines.

#### IV. Conclusion

In this paper we show that there is a fair amount of price dispersion for red and white wines in the United States, with an average per-wine coefficient of variation of 23 percent. Some of this is due to differential market conditions.

But our evidence suggests that dispersion also depends (weakly) on price levels, after controlling for consumer, market, and state heterogeneity. These results are consistent with the theory of “learning-by-buying” in which goods that are purchased more often are predicted to have less price heterogeneity. The results are less consistent with a search costs story. To be consistent with our results, search costs would have to be higher for expensive wines relative to less-expensive wines. This seems less plausible to us because the search mechanisms are likely to be the same for both inexpensive and expensive wines. It may be, however, that buyers of more expensive wines have a higher opportunity cost of time and are less willing to spend time searching for the lowest price.

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