

# ECON-L1300 Empirical Industrial Organization: Static models – Lecture 9 – Mergers

---

Ari Hyytinen, Tanja Saxell, Otto Toivanen, [Iivo Vehviläinen](#)

March 28, 2022

Aalto University

*[iivo.vehvilainen@aalto.fi](mailto:iivo.vehvilainen@aalto.fi)*

## Lecture 9 – Mergers

- Introduction and common concepts
- Merger simulation (Nevo, 2000)

## Lecture 10 – Market power

- Guest lecture: Riku Buri from FCCA
- Market power (Nevo 2001)

## “Advantages of horizontal merger

- Competition: there is less of it. A lateral integration reduces that number of competitors that there are in the marketplace. If a market has five major competitors, and two of them merge, there are now only four rivals. The integrated company can focus more on improving its product or service and less on finding out what the competition is doing and taking necessary measures.”

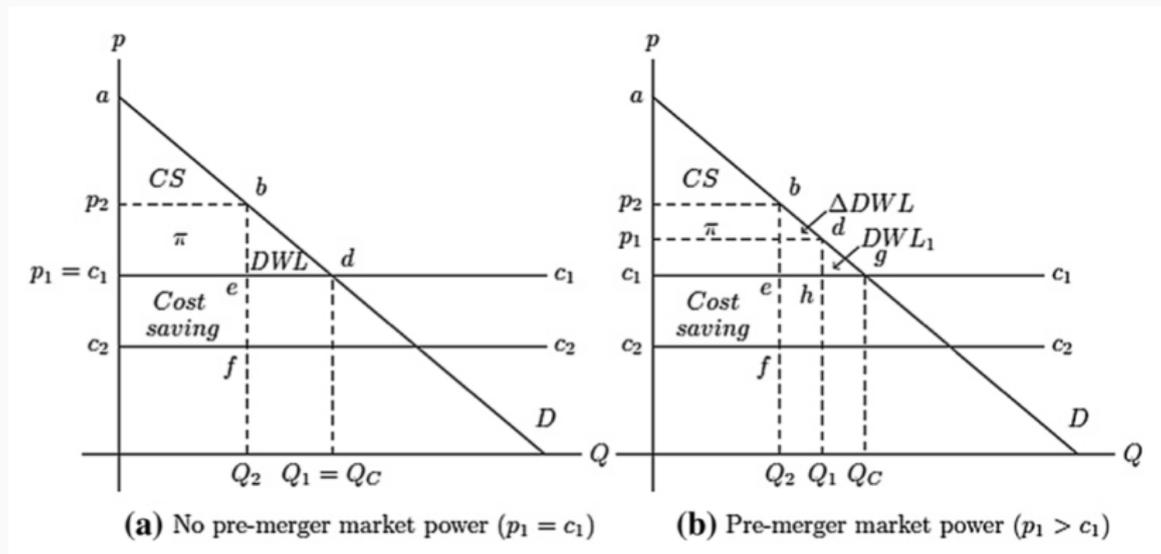
→ Or the complete opposite is the case?

- Horizontal mergers
  - Merged firms produce substitutes
  - We focus on these
- Vertical mergers
  - Products of the firms are complements
  - Reduction of double marginalization
  - Not in our focus
- Mergers of platforms in multisided markets
  - Tricky in theory and practice
  - Fan (2013) one early case, but relies heavily on the particularities of the industry (newspapers)
  - Jeziorski (2014) uses BLP type identifying assumptions in the radio industry

- Unilateral effects
  - The merged entity has an incentive to raise prices post-merger
  - We focus on these
- Coordinated effects
  - Merger results in an increased likelihood of tacit collusion (Ivaldi et al., 2003)
- Other considerations
  - Merger dynamics
  - Endogenous merger choice
  - Entry and exit
  - Investments and innovations
  - Product quality, positioning, bargaining power

## Reminder: Naive merger analysis

Williamson tradeoff:



Farrell and Shapiro, 1990: If the merger does not generate synergies, then consumer surplus decreases.

1. Retrospective evaluations of mergers
  - Study price and market share effects of mergers in a given industry with reduced form, diff-in-diff, etc.
  - Not in our focus
2. Merger simulations with structural models
  - Quantify the trade-off between efficiency and
  - Estimate demand system, change market structure, estimate synergies, and simulate new prices
  - This is us

1. Market definition
  - Define relevant market
2. Measure concentration
  - HHI and upward pricing pressure
3. Merger simulation
  - Advantage: Can do counterfactuals
  - Disadvantage: Complex, data intensive, time consuming

- First question in relation to a merger: When to intervene?
  - Practice: threshold values in terms of  $HHI$
  - The 2010 Guidelines: post-merger  $HHI > 2,500$  and  $\Delta HHI > 200$  “presumed to be likely to enhance market power”
  - Defining the relevant market may be problematic
- Demsetz critique:
  - Market structure is endogenous
  - Efficient firms can set lower prices and gain market share
- Also obvious:  $HHI$  measures market shares only

- Recent findings revive the relevance of  $HHI$ , e.g.
  - $HHI$  reflects the ratio of producer surplus to consumer surplus for many oligopolistic models (Spiegel, 2020)
  - $\Delta HHI$  informative in differentiated product price competition with nested logit (Nocke & Shutz, 2018)
- Intuition for usefulness:
  - Even in the random-coefficients logit model, diversion-by-share emerges as products become more similar in their attributes, which suggests that the logit model often provides a good representation of narrowly defined antitrust markets (Miller & Sheu 2021)

- In general, market shares reveal little about the true substitution patterns
- Diversion ratios more to the point: how much does the change in price of good  $j$  shift demand to good  $k$

$$D_{jk}(p_j, p_k) = \frac{\partial q_k}{\partial p_j} / \frac{\partial q_j}{\partial p_j}$$

- Why not use just cross-elasticities?
  - Scaling makes the diversion ratios comparable.
  - Gives a fraction of the switchers choosing good  $k$
- Interpretation:
  - High diversion = close substitutes  $\rightarrow$  merger increase prices
  - Very low diversion  $\rightarrow$  not the same market?
  - Merger control: What needs to be divested?

- Take pre-merger first-order conditions for a firm  $i$ :

$$f_i(p) \equiv - \left( \frac{\partial q_i(p)^\top}{\partial p_i} \right)^{-1} q_i(p) - (p_i - mc_i) = 0$$

- Merger of firms  $j$  and  $k$  leads to a change in the first-order conditions

$$f_j(p) - \underbrace{\left[ \frac{\partial q_j(p)^\top}{\partial p_j} \right]^{-1} \left( \frac{\partial q_k(p)^\top}{\partial p_j} \right)}_{\text{Diversion from } j \text{ to } k} \underbrace{(p_k - mc_k)}_{\text{Markup of } k} = 0$$

- Do check where these come from (Farrell & Shapiro, 2010)

- Incentive of the merged firm to increase prices depends on
  1. Diversion
  2. Markup
- Upward pricing pressure (UPP) measures the opportunity cost on the merging firms (ignoring cost effect to  $j$ ):

$$UPP_j = D_{jk}(p_k - mc_k)$$

- Markup from diversion from  $j$  to  $k$  is internalized by the merged entity post merger
- Note: Derivation here and throughout the lecture relies on Bertrand-Nash, see Jaffe & Weyl (2013) for discussion

Still need to capture the equilibrium responses of firms.

For this we need merger simulation:

- Model a demand system and estimate it
- Assume a model of competition and estimate supply
  - Cournot mergers often seemingly paradoxical (Salant et al. 1983): merged firm reduces output so that profits can drop (but premerger allocation inefficient  $\rightarrow$  welfare can increase)
  - Multi-product Bertrand basic workhorse assumption
- Adjust marginal costs with synergies
  - Based e.g. on engineering estimate or econometric analysis
  - First guess: set synergies to zero
  - Also used the other way around: what are the synergies that would be needed to compensate the anti-competitive effects
- Solve the new equilibrium

1. Estimate a brand-level demand system for ready-to-eat cereals
  - Observable product characteristics
  - Consumer preferences depend on demographics
  - Control for unobserved brand and market specific characteristics
2. Simulate postmerger price equilibrium
  - Uses the same estimated demand model
  - Further assumptions on efficiencies and firm conduct

Indirect utility given by

$$u_{ijt} = x_{jt}\beta_i^* + \alpha_i^* p_{jt} + \xi_{jt} + \epsilon_{ijt} \equiv V_{ijt} + \epsilon_{ijt},$$

$$i = 1, \dots, I_t, \quad j = 1, \dots, J_t, \quad t = 1, \dots, T,$$

where  $x_{jt}$  product characteristics,  $p_{jt}$  price of  $j$  in market  $t$ ,  $\xi_{jt}$  unobservable characteristics,  $\epsilon_{ijt}$  error term. Further,

$$\begin{pmatrix} \alpha_i^* \\ \beta_i^* \end{pmatrix} = \begin{pmatrix} \alpha \\ \beta \end{pmatrix} + \Pi D_i + \Sigma v_i, \quad v_i \sim N(0, I_{K+1}),$$

where  $D_i$  contains demographics and  $\Pi$  gives how tastes vary by demographics and  $v_i$  unobserved consumer attributes.

Consumers choose the product with the highest utility and there is an outside good (consumers do not choose any product). The market shares are then given by

$$s_{jt}(x_{.t}, p_{.t}, \xi_{.t}; \theta) = \int_{A_{jt}} dP^*(D, v, \epsilon) = \int_{A_{jt}} dP^*_\epsilon(\epsilon) dP^*_v(v) dP^*_D(D),$$

Cross-price substitution patterns will driven by product characteristics

In equilibrium, first order conditions for firm  $j$  are

$$s_j(p) + \sum_{r \in \mathcal{F}_j} (p_r - mc_r) \frac{\partial s_r(p)}{\partial p_j} = 0.$$

Defining the following matrix ( $\mathcal{H}_t$  in Supply lecture notation)

$$\Omega_{jr}^{pre}(p) = \begin{cases} -\partial s_j(p) / \partial p_r, & \text{if } \exists f: \{r, j\} \subset \mathcal{F}_f; \\ 0, & \text{otherwise.} \end{cases}$$

gives the following markup and marginal cost equations

$$p - mc = \Omega^{pre}(p)^{-1} s(p) \Rightarrow mc = p - \Omega^{pre}(p)^{-1} s(p).$$

$$p - mc = \Omega^{pre}(p)^{-1}s(p) \Rightarrow mc = p - \Omega^{pre}(p)^{-1}s(p).$$

Implications:

1. Marginal costs are estimated from the demand model
2. Assumed Nash-Bertrand pricing game
  - Nevo 2001: no evidence on collusion

Post-merger prices are given by

$$p^* = \widehat{mc} + \Omega^{post}(p^*)^{-1}s(p^*),$$

Assumptions:

1. The same model of firm conduct post-merger
2. No change in marginal costs, i.e. production costs or retailer markups
3.  $\Omega^{pre}$  and  $\Omega^{post}$  differ only in ownership structure: no change in strategy of firms, characteristics, or the value of the outside good

$$p^* = \widehat{mc} + \Omega^{post}(p^*)^{-1}s(p^*),$$

- Solving  $p^*$  is equivalent to solving a system of nonlinear equations of dimension  $J$ , needs to be done in each market
- Tricky, as not sure on how to find equilibrium
  - Equilibrium price condition is not necessarily a contraction
  - Don't know if the equilibria are unique solutions to the systems of equations implied by the first-order conditions.
- Conlon and Gortmaker 2020 improve on the standard numerical implementation, but heed with caution here!

- IRI Infoscan scanner data
  - Market shares (one serving per consumer per day)
  - Prices
  - 25 brands in 67 cities over 20 quarters
- Other data
  - Advertising data
  - Characteristics from cereal boxes
  - Demographics and cost instruments

Table 1: Example of product data

market	ids	city	ids	quarter	product	ids	firm	ids	brand	ids	shares	prices	sugar	mushy
C01Q1		1		1	F1B06		1		6		0.008	0.114	18	1
C01Q1		1		1	F1B07		1		7		0.013	0.132	4	1
C01Q1		1		1	F1B09		1		9		0.006	0.130	3	0
C01Q1		1		1	F1B11		1		11		0.018	0.155	12	0
C01Q1		1		1	F1B13		1		13		0.027	0.137	14	0
C01Q1		1		1	F1B17		1		17		0.025	0.144	3	1
C01Q1		1		1	F1B30		1		30		0.005	0.128	4	0
C01Q1		1		1	F1B45		1		45		0.005	0.150	14	0
C01Q1		1		1	F2B05		2		5		0.038	0.109	1	0
C01Q1		1		1	F2B08		2		8		0.008	0.132	11	0
C01Q1		1		1	F2B15		2		15		0.007	0.112	4	1
C01Q1		1		1	F2B16		2		16		0.030	0.115	3	1
C01Q1		1		1	F2B19		2		19		0.100	0.111	13	0
C01Q1		1		1	F2B26		2		26		0.013	0.128	13	0
C01Q1		1		1	F2B28		2		28		0.024	0.175	16	1
C01Q1		1		1	F2B40		2		40		0.009	0.134	10	0
C01Q1		1		1	F2B48		2		48		0.003	0.147	3	0
C01Q1		1		1	F3B06		3		6		0.019	0.110	20	1
C01Q1		1		1	F3B14		3		14		0.011	0.137	7	0

Table 2: Example of agent data

market	ids	city	ids	quarter	weights	nodes0	nodes1	nodes2	nodes3	income	income <sup>2</sup>	age	child
C01Q1	1	1	1	0.05	0.43	-1.50	-1.15	0.16	0.50	8.33	-0.23	-0.23	
C01Q1	1	1	1	0.05	-0.73	0.13	-0.50	0.13	0.38	6.12	-2.53	0.77	
C01Q1	1	1	1	0.05	-0.62	-0.14	0.80	-0.80	0.11	1.03	-0.01	-0.23	
C01Q1	1	1	1	0.05	-0.04	1.26	-0.68	0.26	-1.49	-25.58	-0.83	0.77	
C01Q1	1	1	1	0.05	-0.47	0.23	1.04	0.09	-0.32	-6.52	-0.23	-0.23	
C01Q1	1	1	1	0.05	0.80	-0.71	1.89	-0.34	-0.34	-6.88	0.85	-0.23	
C01Q1	1	1	1	0.05	1.51	0.04	0.45	-1.20	-0.01	-1.15	0.14	-0.23	
C01Q1	1	1	1	0.05	-0.36	0.91	0.76	2.09	0.30	4.73	0.30	-0.23	
C01Q1	1	1	1	0.05	-0.11	-0.35	-0.18	-0.11	-0.33	-6.73	-0.34	-0.23	
C01Q1	1	1	1	0.05	-0.86	-1.39	-0.13	-0.94	1.01	18.33	0.67	-0.23	
C01Q1	1	1	1	0.05	0.66	1.81	0.46	-1.00	1.12	20.60	0.30	-0.23	
C01Q1	1	1	1	0.05	1.00	0.17	-0.41	-1.39	-0.57	-10.96	0.24	-0.23	
C01Q1	1	1	1	0.05	0.34	1.83	-1.59	-0.15	1.54	29.31	0.03	-0.23	
C01Q1	1	1	1	0.05	0.76	-1.29	0.78	-0.52	-0.18	-4.07	0.27	-0.23	
C01Q1	1	1	1	0.05	0.81	-0.09	0.93	-0.57	0.09	0.83	-0.74	0.77	
C01Q1	1	1	1	0.05	-0.88	0.24	-2.04	-1.75	-1.67	-28.32	-1.28	0.77	
C01Q1	1	1	1	0.05	0.39	-0.56	-1.70	1.03	-0.40	-7.93	-0.74	0.77	
C01Q1	1	1	1	0.05	0.86	0.54	-0.16	2.02	0.32	4.93	0.14	-0.23	
C01Q1	1	1	1	0.05	1.62	-0.21	1.08	0.19	1.39	26.26	0.14	-0.23	
C01Q1	1	1	1	0.05	-1.51	-1.25	1.15	-0.04	0.21	2.93	0.89	-0.23	

- Identifying assumption: population moment condition

$$E[Z' \cdot \omega(\theta^*)] = 0,$$

- Requires a set of exogenous instruments  $Z$
  - The error term  $\omega_{jt}$  is the unobserved city-quarter deviation from the overall mean valuation of the brand
- Proxies for cost shifters: Hausman IVs
    - Marginal costs the same in any two cities
    - Assume: city-specific valuations independent across cities
    - Uncorrelated with market specific valuation

Now let's see the implementation

[https://pyblp.readthedocs.io/en/stable/\\_notebooks/tutorial/nevo.html](https://pyblp.readthedocs.io/en/stable/_notebooks/tutorial/nevo.html)

## Can merger simulations be trusted?

- Ex-post evaluation of merger simulations
  - Simulate the model
  - Observe real price and market share shifts
  - Infer change in competitive behavior post-merger
- Example: Björnerstedt & Verboven, 2016
  - Study a larger merger in the Swedish market for painkillers
  - Obtain roughly the right price levels marketwide but cannot explain the firm level prices
  - Suggest an cost increase or tacit collusion as explanations
- Example: Miller & Weinberg, 2017
  - Document the price impacts of the MillerCoors joint venture (reviewed as a merger)
  - Reject the hypothesis that increase in prices is caused by a shift from one Nash-Bertrand equilibrium to another

- BLP framework gives a consistent starting point that is well-suited for a merger analysis
- Full merger simulation is a laborious exercise with high requirements for data
  - PyBLP a great leap forward
- Next time:
  - Discussion of the practice of merger control (Riku Buri)
  - Continue with the cereals, market power (Nevo 2001)