
Using Structural Models To Simulate IP Damages

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Disclaimer: Views are my own, not necessarily those of FTC or any
of its Commissioners.

Co-author Acknowledgements

- Werden, Langenfeld, "Lost Profits from Patent Infringement: The Simulation Approach", *International Journal of the Economics of Business*, 7(2) (July, 2000) 213-227.
- Werden, Beavers, "Economic Analysis of Lost Profits from Patent Infringement With and Without Noninfringing Substitutes," *American Intellectual Property Law Association Quarterly Journal*, 27 (1999) pp. 305-333.
- Werden, Beavers, "Quantity Accretion--The Mirror Image of Price Erosion from Patent Infringement," *Journal of the Patent and Trademark Office Society*, 81 (1999) pp. 479-482.
- Online patent damage Simulator:
<http://www.antitrust.org/simulation.html>

Outline

- Economic Methodologies for predicting unobserved “but-for” worlds
- Accounting Methodologies used for predicting unobserved “but-for” worlds
- Comparison & Illustration
- How do you challenge economic model-based simulation?

Litigation Poses Difficult Questions

- Will this merger raise price?
- How much did this conspiracy raise price?
- What would profits have been absent some illegal behavior?
 - Patent infringement
 - Antitrust violation
- These questions compare two states of the world, but only one is observed

How Do We Predict the Unobserved State of the World?

- Natural experiments
 - Using historical data and empirical model to compute “but-for” world.
 - Best--if nature has performed good experiment
- Classroom experiments
 - FCC used experiment to predict effects of ATT-Comcast
- Structural models
 - Estimate parameters
 - “Simulate” unobserved state of the world
 - Good if model captures reality; and good estimates.

Natural Experiments are Best but Good Data are Rare

- Compare control vs. treatment group

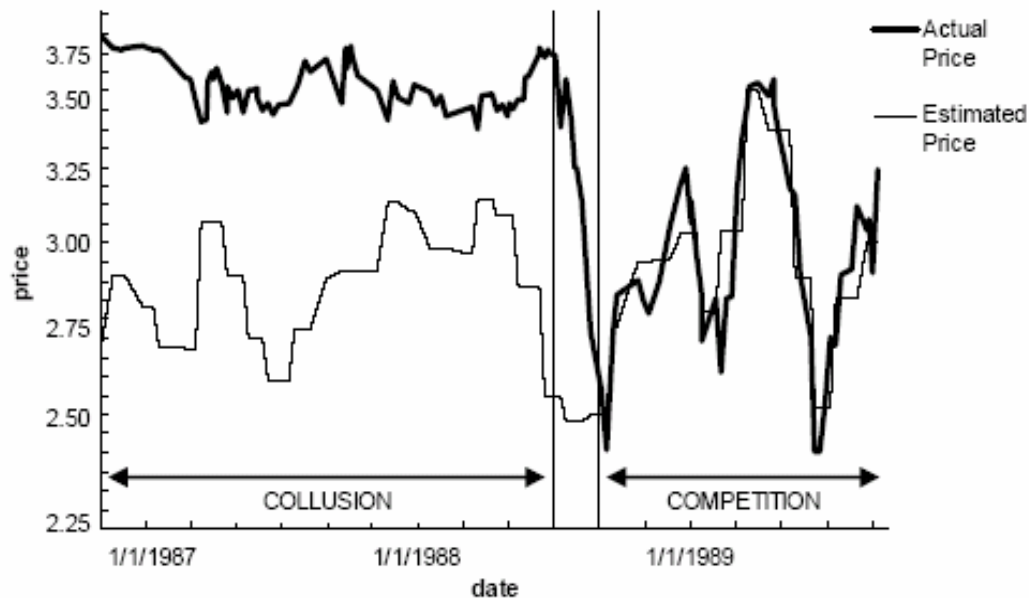


Figure 1. Actual and estimated prices for frozen perch at auction.

- Try to hold everything else constant
 - Backcast is the “control” group

Structural Models

- Specify and estimate model
- Make sure model can explain observed state of the world
- “Simulate” unobserved state of the world
- Models tell you
 - What matters, why, and how much
- Models force economists to “put cards on table”
 - Assumptions are explicit;
 - Clear link from evidence to conclusions
 - Attack “linkage” (model) or attack evidence

“but-for” World in IP Litigation

- Synonyms: “unobserved state,”
“counterfactual”
- Reasonable Royalties: if infringer had legally licensed patent
 - Infringer would have made fewer sales (higher costs)
 - Patentee would have competed less vigorously
 - Rivals would react with higher prices
- Lost Profits: if infringer had never existed
 - Patentee would have charged more and sold more
 - Rivals would have charged more and sold more too

Courts Compute IP Damage with Crude Rules of Thumb

- Drawing bright lines where there are none
 - “acceptable” vs. “unacceptable” substitutes
 - similar problem to market delineation in merger analysis
- Accountants project pre-infringement growth to post infringement period or project sales based on company documents.
 - Ignore market shocks that occur post-infringement
- Accountants infer lost sales from market shares
 - With non-infringing competitors

Accounting For Market Forces

- Price Erosion
 - Infringement leads to lower prices
- Quantity Accretion
 - Infringement leads to higher quantity
- Inferring Substitution Patterns from Market Shares
 - Property of logit demand
- Structural Economic Models take account of all these factors simultaneously
 - 1995 David Evans applied logit merger model to patent infringement case

Types of Structural Models

- Homogenous product, “Cournot”
 - Firms set quantity
- Differentiated products, “Bertrand”
 - Firms set price
- Unique products or services, “Auctions”
 - Firms bid for right to buy or sell
- Unique products or services, “Bargaining”
 - Alternatives to agreement determine terms of bargain

Simulation vs. Market Share Rule

- Damages (% of patentee profit) in a Hypothetical Case Based on Mor-Flo

Methodology	Elasticity of Demand		
	-0.5	-1	-2
Simulation (Bertrand model)	19.7%	7.4%	3.8%
Market-share rule (no erosion)	17.7%	17.7%	17.7%

BIC Leisure v. Windsurfing Int'l.

- Patent Damages in a \$1,000's

	Licensee Sales	Patentee Sales	Total
Original Award	750	2,102	2,852
Simulated Damages	376	1,115	1,491
Simulated Damages (nest)	403	890	1,293
Royalty Only Award			1,079

Online Games (if time)

- <http://www.antitrust.org/simulation.html>

When to Use Simulation: Mergers vs. IP

- Using simulation to inform policy is easier than applying model to a specific case
 - Much we don't know
 - Like whether models can predict real outcomes
- Merger Guidelines are good alternative in merger cases
 - Jan. 29, 2004, Brownbag on Merger Simulation
- Simulation may be best alternative in damage cases

How to Challenge Simulation

- “An expert is someone who knows some of the worst mistakes in his subject and who manages to avoid them” --Werner Heisenberg (1969)
- The worst mistakes occur when practitioners use the methodology to predict the future without first making sure that it can accurately describe the present.
- Courts give a break to plaintiffs
 - Lower burden of proof
 - But assumptions can be potentially tested
- Some number beats no number
 - Show that your model is better than rival's.

Concord v. Brunswick

“Neither the Daubert analysis nor the Federal Rules of Evidence requires a district court to admit opinion evidence that is connected to existing data only by the ipse dixit of the expert. **A court may conclude that there is simply too great an analytic gap between the data and the opinion proffered.** A court must focus on the reasonableness of using a particular approach, along with the expert's particular method of analyzing the data thereby obtained, to draw a conclusion regarding the particular matter to which the expert testimony was directly relevant.”

How do You Tell if the Model Cannot Describe the Present?

- Structural models have three components
 - Consumer model (“demand”)
 - Firm model (“supply”)
 - Equilibrium: how consumers & firms interact
- Each makes assumptions or predictions that can be refuted by evidence

Does Demand Model Accurately Characterize Consumer Behavior?

- Who is choosing?
 - e.g., drugs (MD, PBM, consumer)
- Do they make a single choice from a well defined set of alternatives?
- Do they make choices based on relative prices?
- Do they stockpile inventory?
- How is heterogeneity handled?

Does Firm Model Accurately Characterize Firm Behavior?

- Do firms behave as modeled?
 - Four “P’s” of Marketing: Price, Product, Placement, and Promotion
- Do firms differ as modeled?
 - Margins, elasticities, Costs
- Are costs as modeled?
- Is the retail sector “transparent?”
- Is competition static?

Does Model Accurately Characterize Equilibrium?

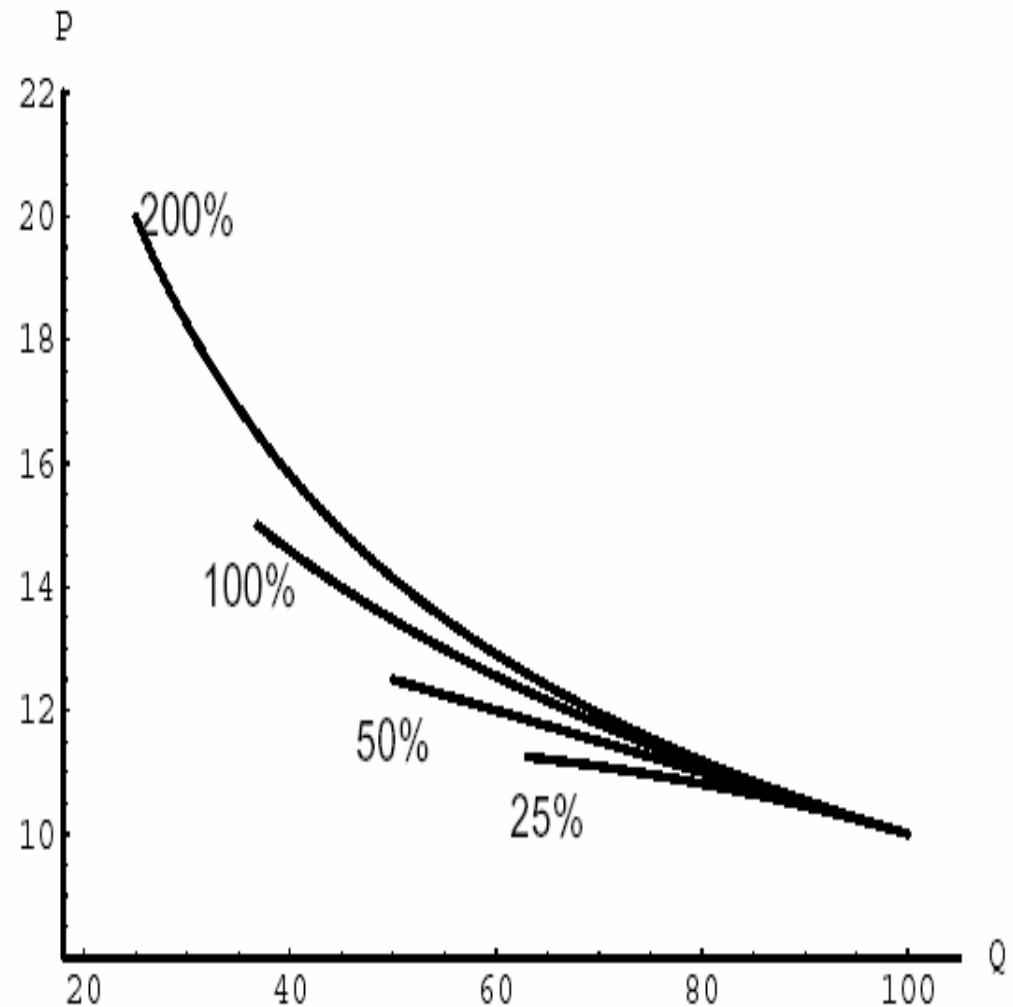
- Do real margins look like actual margins?
- Do prices vary with marginal cost?
 - e.g., seasonality in pricing
- What happens following past entry or disappearance of a competitor?
 - Can model explain the past?

How Well Must Structural Model Fit?

- Models are abstractions that can never be perfect descriptions of the real world
- What matters is not whether the model is unrealistic in any way, but rather whether it is unrealistic in ways likely to make it misleading
- It must fit better than the alternative
 - “Some number beats no number”

WARNING: Extrapolation Depends on Demand Curvature

- Almost impossible to know what this looks like.
- Bigger problem in Damage estimation
- Solution: use conservative assumption.
- Or do sensitivity analysis.
- e.g., Four demand curves



Current Agenda

- Reassessment
 - Over a decade since merger simulation was first used
- Simulation puts IO Economists in the prediction business.
 - What can we learn from macroeconomists?
- Ultimate Test: **OUT-OF-SAMPLE PREDICTIONS!**
 - How well can model predict real events?