



The distribution of prices charged by contractors in a county is also very similar across counties. The reciprocal of the price follow a Pareto distribution, with a deviation from the Pareto at the lower end.

The above regularities regarding entry, sales and price distribution can be generated from a model of monopolistic competition and heterogeneous firms who differ in their productivities. The number of firms that enter the market is restricted by the fixed entry cost. The main entry cost in solar installation industry is the advertising cost, which is modeled according to Eaton, Kortum and Karamarz (2011) and Arkolakis (2010). Firms enter a market as long as they can cover the entry cost, and the marginal firm (the least productive firm that enters a market) makes just enough profit to cover the fixed cost. In larger markets, more firms enter due to the assumption of monopolistic competition. Firms sell slightly differentiated products which gives each contractor some room to charge a price above its cost. To generate the Pareto sales distribution in each county, it is assumed that firm productivities are drawn from a Pareto distribution. Since productivity is an inverse function of cost, and since all firms charge a constant markup above cost in Dixit-Stiglitz type models, the inverse of price also follows a Pareto distribution.

### Model Calibration

The three underlying parameters in the model are the parameter of the Pareto distribution which determines the distribution of firm productivities, the advertising parameter which determines the effectiveness of advertising in the industry, and the demand parameter that determines the extent of differentiation among the contractors. The Pareto parameter is estimated directly from the data on prices charged by the contractors. The other two parameters are estimated using simulated method of moments. The parameters are estimated by drawing productivities randomly from the Pareto distribution, and by matching the resulting sales distribution with observed distribution in data. With the estimated parameters, model generated patterns of entry and sales distribution hue closely to the one seen in data.

### Simulations

The calibrated model is used to find out the reduction in cost that would have been required to achieve given penetration levels in California in the absence of subsidies. In the absence of subsidies, the price of solar systems would have had to reduce by 40% in order to have reached the penetration level that was achieved in 2012. If the penetration level is to reach 1.5% without subsidies, then

cost would have to fall by 88% of its value in 2012. The model is also used to generate the welfare impact of the consumer subsidy. It is assumed that the subsidies are financed through a tax on consumption of electricity. The difference in consumer surplus (with and without the subsidy) is measured using the concept of equivalent variation. The consumer surplus would have been higher by \$77 million in the absence of subsidies while the producer surplus would have been lower by \$59 million, adding up to a net welfare loss of \$18 million from subsidies. Note, however, that the welfare calculations have been made without considering the environmental consequences of replacing polluting generation sources like coal with solar energy systems.

### Conclusion

Cost reduction in solar panels has been the focus of most studies related to solar PV industry. The impact of competition and market structure on prices of installed solar systems has received much less attention. The data on solar installations in California has been used to understand regularities in related to market structure of the installation industry in California. A model was developed that was consistent with these regularities, and the model was estimated using the installation data. The estimated model was then simulated to understand the welfare impact of government subsidy offered for the purchase of residential solar systems.

### References

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