

# Approximating price vectors

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December 21, 2021

# Introduction



- ▶ Humans are social creatures, our behavior influences other behavior
- ▶ When our peers engage in a behavior, we are more likely do so as well
- ▶ CITE SOME OF THE RELEVANT EXAMPLES INCLUDING SOME SEEN IN CLASS

- ▶ How to analyze the effect of the social network on consumption
- ▶ We will use the model first proposed by [1] and later used by [2] to model an individuals utility  $u$

$$u_i(x, p) = ax_i - x_i^2 + 4\rho x_i \sum \frac{G_{ij}}{\|G + G^T\|} x_j - p_i x_i \quad (1)$$

where  $a, \rho$  are constants and  $p_i$  is the price user  $i$  is charged.

- ▶ A manufacturer who can produce goods at unit price  $c$  with  $c < a$  wants to maximize profits.
- ▶ Use network information to charge influencers less and influencees more.
- ▶ The optimal prices to charge each individual is well understood[1][2]

$$\frac{a+c}{2}\mathbf{1} + \frac{a-c}{2} \frac{\rho}{\|G+G^T\|} (G-G^T)K(G+G^T, \frac{\rho}{\|G+G^T\|}) \quad (2)$$

where  $K(X, y) = (I - yX)^{-1}\mathbf{1}$ , the bonanich centrality vector.

- ▶ But we often don't have ready access to the full network information
- ▶ Given partial enough of the network ex. degrees of network should we do?
- ▶ Specifically, we want a way to generate a “good enough” price vector  $v$  with respect to this partial information  
Goal: minimize expected regret

$$\mathbb{E}\left[1 - \frac{P_G(v)}{\text{Optimal} - \text{Profit}} \mid \text{Statistic of } G\right] \quad (3)$$

Where  $P_G(v)$  is the profit of our  $v$  on the real network  $G$ .

# Degree Sequence Information

- ▶ Suppose we are given the degree sequence of the network  $G$ (directed graph)
- ▶ Strategy 1: Make a new graph  $H$  with the same degree sequence as  $G$  using the configuration model
- ▶ Hypothesis:  $H$  behaves like  $G$  so maybe the optimal price vector of  $H$  is close to the optimal price vector of  $G$
- ▶ It is not obvious that local properties of the network should strongly impact global properties(optimal profit)

# Results

- ▶ The answer is yes, this is a strategy to get good price vectors for an unknown graph
- ▶ The following results will show this to be the case



# Details of Testing

- ▶ Generate a graph  $G$  with the Erdos-Renyi model with  $n$  nodes and link probability  $p$
- ▶ Generate either Same Parameter graphs(i.e. same  $n$  and  $p$  but no further restriction) or Graphs with the same sequence
- ▶ After we have generated a price vector use  $G$  to check how close we were.
- ▶ Examine experiment various properties of these samples

# Distribution of profits

- ▶ How much more money do we make applying a Same-Sequence price vector than a Same-Parameter to the true graph

# Statistic of distribution of Profits

fdafd

# Distribution of Prices

- ▶ The next question to ask is do the same sequence price vectors look like the optimal price vector?
- ▶ Again the answer is yes

# Statistics of the Prices

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## A second strategy

- Above we have shown that the price vector of generated graphs is on average like the optimal price vector

strategy 2 The averaged price vector is even more like the optimal price vector

$$v = \frac{1}{\# Trials} \sum Profit_G(\text{Guessed vector}) \quad (4)$$

$$v = Profit_G\left(\frac{1}{\# Trials} \sum \text{Guessed vector}\right) \quad (5)$$

# Results

# Other Directions



- ▶ If knowing the degrees is good then maybe knowing  $[|N(v)|, |N(N(v)) \setminus (N(v) \cup v)|]$  is better
- ▶ i.e. how many nodes can  $v$  reach in 1 or 2 steps
- ▶ What about  $k$  steps?



# Results for limited walk information

# Future Work

- ▶ Mathematical Assurances of error in either strategy
- ▶ Other Network distributions other than Erdos Renyi

-  O. Candogan, K. Bimpikis, and A. Ozdaglar, “Optimal pricing in networks with externalities,” *Operations Research*, vol. 60, no. 4, pp. 883–905, 2012.
-  J. Huang, A. Mani, and Z. Wang, “The value of price discrimination in large social networks,” *Management Science*, *Forthcoming*, 2021.