

# Three Papers on Strategic Decision Making In Digitally Mediated Markets

Dissertation Defense

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# Chapter 1

## Bidding Strategies for Simultaneous Ascending Auctions

Joint work with Michael P. Wellman, Jeffrey K.  
MacKie-Mason, and Daniel Reeves



## RQ & motivation

Method

Analysis

Results & contribution

# SAA Game: Example

Number of goods

2 stamps: A and B

Number of bidders

2 agents: 1 and 2

Joint distribution of values

F

SAA mechanism rules

concurrent auctions

multiple rounds

highest bid wins



**RQ &  
motivation**

Method

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Results &  
contribution

# Research Question

How should one bid in SAAs  
when the goods are  
complements or substitutes?



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# Motivation

## Example: Exposure Problem

(If agent has complementary preferences)

	Value for stamp A	Value for stamp B	Value for the whole package
Agent 1	20	20	20
Agent 2	0	0	30



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# Motivation

## Example: Own Price Effect

(If agent has substitutable preferences)

	Value for stamp A	Value for stamp B	Value for the whole package
Agent 1	20	20	20
Agent 2	21	21	42



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Common approach to strategy selection:

**Find equilibrium strategies**

**Empirical Game-Theoretic  
Methodology:**

How do we find equilibrium strategies in  
complex SAAs?



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# Analysis

All strategy families belong to class of  
*perceived-price bidders*

## Price-prediction methods

- Myopic prediction
- Based on empirical data from other (simulated) auctions
- Based on Walrasian equilibrium prices
- **Self-confirming prices**



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# Analysis & Results

	<b>Complements (exposure problem)</b>	<b>Substitutes (own price effects)</b>
Largest empirical SAA game	5 goods, 5 agents	5 goods, 5 agents
	“uniform” preference distribution	“uniform” marginal values
	53 strategies	51 strategies
Hypothesized winner	Distribution price predictor w. <i>self-confirming prices</i>	Own-effect price predictor w. <i>self-confirming own-effect prices</i>
Winner	<i>As hypothesized</i>	Demand-reduction strategy



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## Contributions

**If goods are complements**

**Self-confirming  
distribution predictor**

**If goods are substitutes**

**Demand-reduction strategy**

## Chapter 2

# Bundling Information Goods: A Study of Competing Firms Facing Heterogeneous Consumers

Joint work with Jeffrey K. MacKie-Mason and  
Scott A. Fay

## Motivation

### **Why bundling?**

- High 1st-copy costs, low reproduction costs
- Digital technology exaggerates

### **Why competing firms?**

- Monopoly is well studied, competition is not

### **Why heterogeneous tastes?**

- Ex ante homogeneous tastes well studied
- My model is specific to information goods
- My model is appropriate to study mixed bundling



## RQ & motivation

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# Firms & Consumers

- 2 firms, each owns a collection of items
- Subadditive preferences over items
- Reproduction and distribution costs are zero
- Consumers buy at most one copy of an item
- Two-dimensional heterogeneity of tastes
  - $w$  - value of favorite item
  - $k$  - percentage of items valued positively
- 3 bundling strategies
  - Individual items (pure unbundling, PU)
  - Pure bundling (PB)
  - Mixed bundling (MB)
- Simultaneously choose scheme and prices



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# Research Questions

- Can simple MB effectively sort consumers under competition?
- How do equilibrium profits compare to those when firms are restricted to PB or PU?  
How do PB and PU compare to each other?
- How big is the difference?
- How much surplus do bundling firms extract under competition? How does it compare to monopoly profit?
- Market efficiency? Relative to monopoly?



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# Method

Empirical Game Analysis



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motivation

Method


**Analysis**

Results &  
contribution

# Empirical Game Analysis

## 9 environments

- 3 distributions of consumer preferences
  - fixed  $w$ ,  
 $k$  exponentially decreases with number items that a consumer values positively
  - fixed  $k$ , uniformly distributed  $w$
  - uniform  $w$ , exponential  $k$
- For each, 3 market models:
  - symmetric duopoly
  - non-symmetric duopoly
  - monopoly



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**Results &  
contribution**

## Monopoly Results

- Whether MB can effectively sort consumers, depends on consumer preference distribution
- PB can be dominated by PU

## Duopoly Results

- Each scheme largely works in the same way as under monopoly to extract consumer surplus
- MB intensifies price competition; can result in lower equilibrium profits than PU or PB

## Duopoly vs. Monopoly

- Market efficiency is greater by up to 16%
- Welfare shifts toward consumers by up to 22%
- Largest drop in profits is by 21%



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contribution**

## Contributions

- Extended analysis of bundling schemes to a competitive setting
- .. for a model of consumer preferences specific to information goods

### **Particularly interesting:**

- Under what preference distributions
  - MB works as price-discrimination tool
  - Pure schemes yield higher profits in equilibrium
- Even under monopoly PU can dominate PB



# Chapter 3

## Learning Bayesian Nash Equilibrium: An Experimental Study

Under supervision of Yan Chen and Jeffrey K.  
MacKie-Mason



## RQ & motivation

Method

Hypotheses

Results & contribution

# Research Questions

In games of incomplete information,

- Do people learn to play Bayesian Nash equilibrium (BNE)?
- What factors affect learning of BNE?
- How do the answers differ when the information assumption is not satisfied?



## RQ & motivation

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# Motivation

## **Who cares?**

- Practical applications of game theory

## **Why BNE?**

- Main solution concept in games of incomplete information

## **Why is empirical verification important?**

- “Problematic” theoretical assumptions:
  - common knowledge of type distribution
  - self-interested rational behavior

RQ & motivation

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# Method: Human-Subject Laboratory Experiment

**Domain:** Family of Cournot Duopoly Games

	Bayesian Information		Low Information	
	Non-Potential	Potential	Non-Potential	Potential
Non-Supermodular	3 sessions	3 sessions	3 sessions	3 sessions
Supermodular	3 sessions	-----	3 sessions	-----



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## Convergence Measure

**Distance from equilibrium payoff**

$$= |\text{Actual payoff} - \text{Equilibrium payoff}|$$

## Hypotheses

### Convergence Level & Improvement Rate

<b>Environment</b>		<b>Counterpart Environment</b>
Bayesian info	better/ faster than	low info
potensial	better/ faster than	non-potential
supermodular	different from	non-supermodular

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# Results

## Average Convergence Level

Bayesian info	better than	low info
potensial	better than	non-potential
supermodular	better than	non-supermodular
supermodularity interacts with information: effect is drastically reduced under Bayesian info		

## Rate of Convergence Improvement

Bayesian info	slower than	low info
potensial	faster than	non-potential
supermodular	same	non-supermodular



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## Contributions

- **What factors affect learning of BNE?  
How does the answer differ when the  
info assumption is not satisfied?**

potential, supermodularity, info;  
possible losses, incentives to collude

**Particularly interesting:**

interaction b/w supermodularity and  
info appears to be due to different  
types of irrationality that prevail

- **Do people learn to play BNE?**

Average distance in last 10 rounds is  
9--18% of average payoff range



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Thank you.