

## Signaling

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10/27/2010



## Applying for Economics Graduate School

An Example of Signaling



### Questions



- What should I apply? MBA or Econ PhD?
- What's the most important factor if I apply?
- Are foreigners/females discriminated against?
- Is mathematics needed in graduate school?
- Is MA (at NTU) required before I enter PhD?
- How should I prepare myself now?

### What Program Should I Apply?



- MBA or Econ PhD?
- This depends on Your **Career Interest**
- However, MBA is **NOT** for “newly graduates”
  - MBA is designed for people who have worked for years and are heading for top management
- They teach **undergraduate level** Economics, but
  - tie it with actual working experience
  - Socializing with other CEO-to-be's is a bonus

### What Program Should I Apply?



- Econ PhD provides you the rigorous training to modern “economic analysis” techniques
- This is used by
  - Academics (Economics, Public Policy, Law, etc.)
  - Economics Consulting Firms
  - Public Policy Evaluation
  - Financial Companies (like Investment Banking)
  - International Organizations (APEC, IMF, etc.)

### Most Important Factor



- What is the Most Important Factor when I Apply for Graduate School?
- Petersons Guide surveyed both students and admission committee members (faculty)
- They find that both agree No.1 factor is:
  - Letter from someone the committee knows
- Why is this No.1?
- **Credible Signaling!**

## Most Important Factor



- No.1:
  - Letter from someone the committee knows
- Who are the people committees know?
- What if I cannot find someone to write?
- Find Other “Credible Signals”!
  - GPA?
  - GRE or TOEFL?
  - Other Distinct Features?

## Discrimination and Gender



- Are Foreigners or Females Discriminated Against?
- **Foreigners:**
  - Different Programs have different policy
  - UCLA (8/35) vs. MIT (25/30)
- **Women:** Only 16% of the Faculty are Female
  - Does the market favor women? Maybe...
  - **Comparison:** 33% Math Professors are Female

## Is Mathematics Needed?



- Advice for Econ PhD Applicants:
  - Take a heavy dose of mathematics during undergraduate. ~ Peterson's Guide
- So, the answer is generally “yes.”
  - There is a “gap” between undergrad & graduate...
- However, the ability to **find economic intuition behind the math** is even more essential
  - My first year micro comp. experience...
- They need **Bilingual** People!

## Is Mathematics Needed?



- What Kind of Math is Needed?
- **Advanced Calculus** – Score 80 or higher
  - The thinking process required for you to score 80 is what's important
- **Linear Algebra** – Basic Tool for Econometrics
- **Mathematical Statistics** – Econometrics
- The more the better, but mastering these three is better than being a jack of all traits...

## Is MA required before I enter PhD?



- No. Top-10 schools admit only PhD students.
  - Chicago: We'll give you a master if you can't finish.
- However, you might not be able to survive studying both math & economics **in English**...
- Hence, a MA might help since
  - MA classes are similar to PhD classes
  - You might not be sure if you want to go for PhD
- **Condition on passing 1st year comp's, MA is unnecessary**, but you may want to hedge...

## How Should I Prepare Myself Now?



- Create **Credible Signals!**
- Such As:
  - GPA 4.0, ranked 1/160
  - Good References
  - A Published Research Paper
  - Take a Heavy Dose of Mathematics
  - Take Graduate Level Courses in Economics
  - Take Economics Courses Taught in English

## Signaling

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## What Makes a Signal Work?

- A Signal must be **affordable** by certain types of people
  - Cost < Benefit (if receivers “decodes” it)
- A signal must be **too expensive** for players of the wrong type to afford
  - Cost > Benefit (even if receivers “decodes” it)
- **Separating Equilibrium**: Those who buy and those who don't are of different types



## What Makes a Signal Work?

- **Separating Equilibrium** consists of a circular argument:
  - Signal senders buy the signal anticipating receivers decode it
  - Receivers get assurance about sender types from the signal and act different with/without it
  - This is a **self-fulfilling prophecy**
- Spence (Dissertation 1974)



## What Makes a Signal Work?

- **Exercise**: Show which types of people can afford the following signals:
  - GPA 4.0, ranked 1/160
  - Good References
  - A Published Research Paper
  - Take a Heavy Dose of Mathematics
  - Take Graduate Level Courses in Economics
  - Take Economics Courses Taught in English



## Theory of Signaling

- Harsanyi (MS 1967-68)
  - Types: Privately observe a move of “Nature”
- Bayesian-Nash Equilibrium (multiple!)
  - Separating Equilibrium
  - Pooling Equilibrium
  - Semi-pooling Equilibrium
- Refinements: Sequential, Intuitive, Divine, Universal Divine, Never-Weak-BR, Stable



## Simple Signaling Game

- Brandts and Holt (AER 1992)
- Worker Types are H or L with (2/3, 1/3)
- Seeing own type, Workers can choose to S (skip) or I (invest in education)
- Seeing this action, Employer assign the worker to a D (dull) or C (challenging) job
- Employer payoffs are 125 if she assigns D to L types and C to H types



## Simple Signaling Game

- Workers get 100 doing C and 20 doing D
- L types get additional 40 for taking action S
- H types get 40 for taking action I, 20 for taking S

	Action seeing S		Action seeing I	
	C <sup>S</sup>	D <sup>I</sup>	C <sup>I</sup>	D <sup>S</sup>
Type L	140, 75	60, 125	100, 75	20, 125
Type H	120, 125	20, 75	140, 125	60, 75

## Simple Signaling Game

- Two Pooling Equilibria:
  - Both Types choose S, Employers assign C
  - Out-of-equilibrium Belief: choosing I means L
  - Hence, Employers assign D if they see I
- Sequential Equilibrium
  - Both Types choose S, Employers assign C
  - Out-of-equilibrium Belief: choosing I means L
  - Hence, Employers assign D if they see I
- Intuitive Equilibrium
  - Both Types choose I, Employers assign C
  - Out-of-equilibrium Belief: choosing S means L
  - Hence, Employers assign D if they see S

## Simple Signaling Game

Periods	Message   Type		Action   Type		Equilibrium Predictions	
	I   H	I   L	C   I	D   S	Intuit.	Seq.
1-4	100	25	100	74	100	0
5-8	100	58	100	100	100	0
9-12	100	75	98	60	100	0
Suggest Actions: "C   S, D   I"						
1-4	50	13	60	46	100	0
5-8	75	33	33	67	100	0

## Follow-up Studies

- Banks, Camerer and Porter (GEB 1994)
- Design 7 games, separating:
  - Nash vs. non-Nash
  - Sequential vs. Nash
  - Intuitive vs. Sequential
  - Divine vs. Intuitive
  - Universal Divine vs. Divine
  - NWBR vs. Universal Divine
  - Stable vs. NWBR

## Follow-up Studies

- Results show that subjects do converge to the more refined equilibrium **up to intuitive**
- After that, subjects conform to **neither**
  - Except for possibly Stable vs. NWBR
- Is this a test of refinements, or a test of equilibrium selection?
- Exercise:** Show how equilibria in Table 8.3 (BCP94') satisfy corresponding refinements

## Follow-up Studies

- In game 2-6, different types send different messages
  - No simple decision rule explains this
  - But weak dominance and 1 round IEDS hold
- Are people just level-1?
- Also, how does the convergence work?

## Follow-up Studies

- More studies on learning:
- Brands and Holt (IJGT 1993)
  - Subjects lead to play less refined equilibrium
  - Why? Initial random play produces history that supports the non-intuitive equilibrium
- Anderson and Camerer (ET 2000)
  - EWA yields  $\delta=0.54$  (0.05); does better than choice reinforcement ( $\delta=0$ ) & weighted fictitious play ( $\delta=1$ )

## Specialized Signaling Games

- Potters and van Winden (IJGT 1996)
  - Lobbying
- Cadsby, Frank & Maksimovic (RFS 1990)
  - Corporate Finance
- Cooper, Kagel, Lo and Gu (AER 1999)
  - Ratchet Effect
- Cooper, Garvin and Kagel (Rand/EJ 1997)
  - Belief Learning in Limit Pricing Signaling Games

## Lobbying: Potters and van Winden (IJGT 1996)

- Lobby group is type  $t_1$  or  $t_2$  with  $(1-p, p)$
- Lobby group can send a signal (cost  $c$ )
- Politician chooses action  $x_1$  or  $x_2$  (match type)

Type	No signal		Costly Signal	
	$x_1$	$x_2$	$x_1$	$x_2$
$t_1 (1-p)$	0, $b_1$	$a_1, 0$	$-c, b_1$	$a_1 - c, 0$
$t_2 (p)$	0, 0	$a_2, b_2$	$-c, 0$	$a_2 - c, b_2$

## Lobbying

- For  $\beta = \frac{pb_2}{(1-p)b_1} < 1$ ; there are 2 equilibrium:
- **Pooling**: Lobby groups both don't send signal
  - Politician ignores signal and chooses  $x_1$ 
    - Intuitive, divine, but not universally divine
- **Semi-pooling**: type  $t_2$  always send signal
  - Politicians mix  $x_1, x_2$  with  $(1-c/a_1, c/a_1)$  if signal
- type  $t_1$  mixes by sending signal with prob.  $\beta$ 
  - Universally divine

## Lobbying

Treatment	$\beta$	Signal Freq. ( $t_1, t_2$ )		$x_2$ Freq. (no sig., sig)		
		Actual	Pred.	$c/a_1$	Actual	Pred.
1	0.25	38, 76	25,100	0.25	2, 5	0,25
2(2c)	0.75	46, 100	75,100	0.25	3, 79	0,25
2a(6c)	0.75	83, 93	75,100	0.25	11, 54	0,25
3	0.25	16, 85	25,100	0.75	0, 53	0,75
4	0.75	22, 83	75,100	0.75	5, 80	0,75
Aver.	0.25	27, 81	25,100	0.25	5, 46	0,25
	0.75	50, 92	75,100	0.75	2, 66	0,75

## Lobbying

- Supporting universally divine equilibrium
- Fictitious Play Learning:
  - Past frequency of  $x_2$  after signal is  $r(m)_{t-1}$
- Should signal if  $r(m)_{t-1} a_1 - c > 0$ 
  - Subjects signal 46% if  $>0$ , 28% if  $<0$
  - Politicians choose  $x_2$  77% if  $>0$ , 37% if  $<0$
- Potters and van Winden (JEBO 2000)
  - Similar results; little difference between students and professionals

## Corporate Finance

- Cadsby, Frank & Maksimovic (RFS 1990)
- Firms are either H or L with ( $\frac{1}{2}$ ,  $\frac{1}{2}$ )
  - Worth  $B_H, B_L$  if carry project; worth  $A_H, A_L$  if pass
- Need capital  $I$  to finance the project
- Investors can put up  $I$  and get  $S$  shares
- **Exercise:** When will there be pooling, separating, and semi-separating equilibria?

## Corporate Finance

- Example:
- L types worth 375, 50 (with/without project)
- H types worth 625, 200 (with/without project)
- Capital  $I = 300$
- Separating equilibrium:  $S=0.80$
- Pooling equilibrium:  $S=0.60$
- Semi-pooling equilibrium:  $S=0.68$
- **Exercise:** Show that these are equilibria!

## Corporate Finance

- Cadsby et al. ran 10 sessions (Table 8.11)
- Results support equilibrium (**pooling** if multi.)
  - When unique pooling: all firms offer shares
  - When unique separating: Initially, both offer (pool), but H types learn not to offer (separate)
  - When multiple: Converge to pooling equilibrium
- Cadsby, Frank and Maksimovic (RFS 1998)
  - Add costly signals (see Table 8.12 for results)

## Ratchet Effect

- Cooper, Kagel, Lo and Gu (AER 1999)
- Firms are either H or L with ( $\frac{1}{2}$ ,  $\frac{1}{2}$ )
- Choose output level 1~7
- Planner choose “easy” or “tough” target
  - Set “easy” if  $P(L | \text{output}) > 0.325$
- Pooling Eq: L chooses 1 or 2; H pools with L
- Myopic K firms: Naively pick 5 (& get “tough”)
  - Exercise: Prove these with payoffs in Table 8.13.

## Ratchet Effect

- 70~90% L firms choose 2
- Most H firms choose 2 or 5
- Period 1-12: 54-76% myopic  $\rightarrow$  80% tough
- Period 13-36: Convergence to pooling
- Big context effect only for Chinese manager
  - Provides language to foster learning from exp.
- Cooper, Garvin and Kagel (Rand/EJ 1997)
  - Belief Learning in Limit Pricing Signaling Games

## Reputation Formation

- Camerer and Weigelt (Econometrica 1988)
- 8 period trust game
- Borrower: “normal” (X) or “nice” (Y)
- (New) Lender each period: Lend or Don't
- Borrower chooses to Default or Repay
  - Normal types default; nice types repay

## Reputation Formation



Lender Strategy	Borrower Strategy	Lender Payoff	Borrower Payoff	
			Normal	Nice (Y)
Lend	Default	-100	150	0
	Repay	40	60	60
Don't	-	10	10	10

## Reputation Formation



- What does the equilibrium look like?
- Last Period: Lend if  $P_8(\text{nice}) > \tau = 0.79$ 
  - “normal” borrowers default; “nice” ones repay
- Period 7:
  - “normal” borrowers weigh between default now (and reveal) and default later

## Conditional Frequency of Lending



Round		1	2	3	4	5	6	7	8
3-5	Predict	100	100	100	100	64	64	64	64
	Actual								
6-8	Predict	100	100	100	64	64	64	64	64
	Actual								
9-10	Predict	100	100	100	64	64	64	64	64
	Actual								

## Conditional Frequency of Lending



Round		1	2	3	4	5	6	7	8
3-5	Predict	100	100	100	100	64	64	64	64
	Actual	94	96	96	91	72	59	38*	67
6-8	Predict	100	100	100	64	64	64	64	64
	Actual	96	99	100	95*	85*	72	58	47
9-10	Predict	100	100	100	64	64	64	64	64
	Actual	93	92	83	70	63	72	77	33

## Conditional Frequency of Repay (by X)



Round		1	2	3	4	5	6	7	8
3-5	Predict	100	100	100	81	65	59	44	0
	Actual								
6-8	Predict	100	100	73	68	58	53	40	0
	Actual								
9-10	Predict	100	100	73	67	63	56	42	0
	Actual								

## Conditional Frequency of Repay (by X)



Round		1	2	3	4	5	6	7	8
3-5	Predict	100	100	100	81	65	59	44	0
	Actual	95	97	98	95*	86*	72	47	14
6-8	Predict	100	100	73	68	58	53	40	0
	Actual	97	95	97*	92*	85*	70*	48	0
9-10	Predict	100	100	73	67	63	56	42	0
	Actual	91	89	80	77	84*	79*	48	29

## Follow-up Studies



- Neral and Ochs (Econometrica 1992)
  - Similar repeated trust games
- Jung, Kagel and Levin (Rand 1994)
  - Entry deterrence in “chain-store paradox”
- Camerer, Ho and Chong (JET 2002)
  - Sophisticated EWA (strategic teaching!)

## Conclusion



- Cooper, Garvin and Kagel (EJ 1997)
  - “We do not suggest that game theory be abandoned, but rather as a descriptive model that it needs to incorporate more fully how people actually behave.”
- Possible improvements:
- QRE, level-k or Cognitive Hierarchy
- Learning (EWA or belief learning)