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# **Bayesian Games and Mechanism Design**

## ***Definition of Bayes Equilibrium***

Harsanyi [1967]

- What happens when players do not know one another's payoffs?
- Games of "incomplete information" versus games of "imperfect information"
- Harsanyi's notion of "types" encapsulating "private information"
- Nature moves first and assigns each player a type; player's know their own types but not their opponents' types
- Players do have a common prior belief about opponents' types

## **Bayesian Games**

There are a finite number of types  $\theta_i \in \Theta_i$

There is a common prior  $p(\theta)$  shared by all players

$p(\theta_{-i}|\theta_i)$  is the conditional probability a player places on opponents' types given his own type

The *stage* game has finite action spaces  $a_i \in A_i$  and has utility function  $u^i(a, \theta)$

## ***Bayesian Equilibrium***

A *Bayesian Equilibrium* is a Nash equilibrium of the game in which the strategies are maps from types  $s_i : \Theta_i \rightarrow A_i$  to stage game actions

$A_i$

This is equivalent to each player having a strategy as a function of his type  $s_i(\theta_i)$  that maximizes conditional on his own type  $\theta_i$  (for each type that has positive probability)

$$\max_{s_i} \sum_{\theta_{-i}} u_i(s_i, s_{-i}(\theta_{-i}), \theta_i, \theta_{-i}) p(\theta_{-i} | \theta_i)$$

## ***Cournot Model with Types***

- A duopoly with demand given by  $p = 17 - x$
- A firm's type is its cost, known only to that firm: each firm has a 50-50 chance of cost constant marginal cost 1 or 3.

profits of a representative firm

$$\pi_i(c_i, x) = [17 - c_i - (x_i + x_{-i})] x_i$$

Let us look for the symmetric pure strategy equilibrium

## ***Finding the Bayes-Nash Equilibrium***

$x^1, x^3$  will be the output chosen in response to cost

$$\begin{aligned}\pi_i(x_i, c_i) &= .5 [17 - c_i - (x_i + x^1)] x_i \\ &\quad + .5 [17 - c_i - (x_i + x^3)] x_i\end{aligned}$$

maximize with respect to  $x_i$  and solve to find

$$x^1 = 11/2, x^3 = 9/2$$

## *Industry Output*

probability  $\frac{1}{4}$  11

probability  $\frac{1}{2}$  10

probability  $\frac{1}{4}$  9

Suppose by contrast costs are known

If both costs are 1 then competitive output is 16 and Cournot output is  $\frac{2}{3}$  of this amount  $10\frac{2}{3}$

If both costs are 3 then competitive output is 14 and Cournot output is  $9\frac{1}{3}$

If one cost is 1 and one cost is 3 Cournot output is 10

With known costs, mean industry output is the same as with private costs, but there is less variation in output

# Sequentiality

Kreps-Wilson [1982]

Subforms

Beliefs: *assessment*  $a_i$  for player  $i$  probability distribution over nodes at each of his information sets; *belief* for player  $i$  is a pair  $b_i = (a_i, \pi_{-i}^i)$  consisting of  $i$ 's assessment over nodes  $a_i$ , and  $i$ 's expectations of opponents' strategies  $\pi_{-i}^i = (\pi_j^i)_{j \neq i}$

Beliefs come from strictly positive perturbations of strategies

belief  $b_i \equiv (a_i, \pi_{-i}^i)$  is *consistent* (Kreps and Wilson) if where  $a_i^n$   
 $a_i = \lim_{n \rightarrow \infty} a_i^n$  obtained using Bayes rule on a sequence of strictly positive strategy profiles of the opponents,  $\pi_{-i}^{i,m} \rightarrow \pi_{-i}$



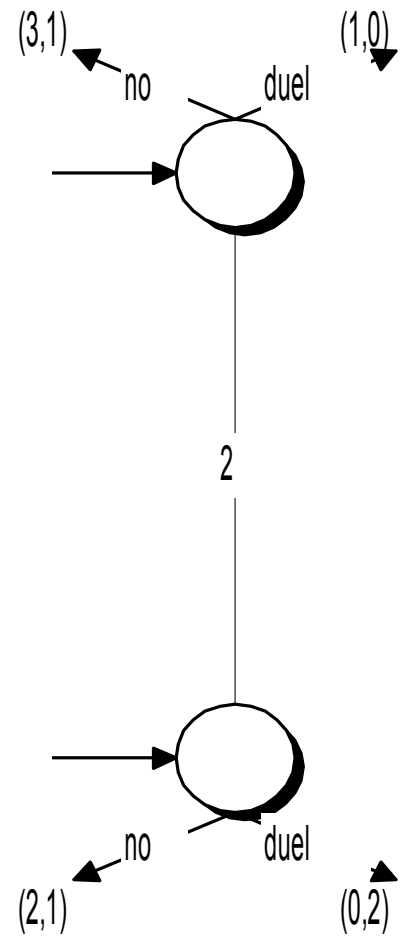
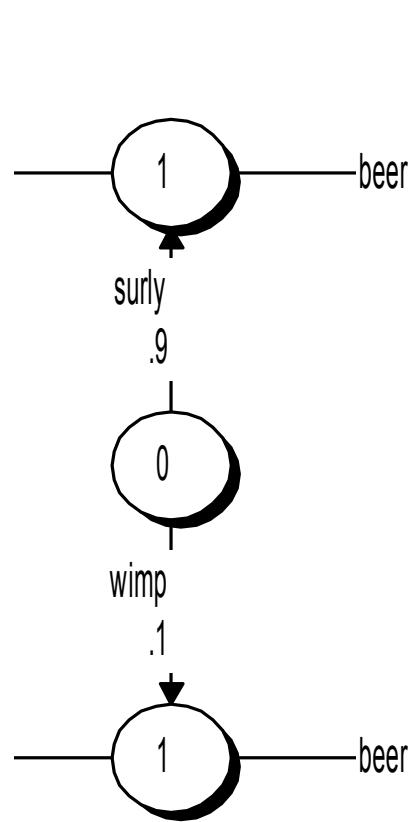
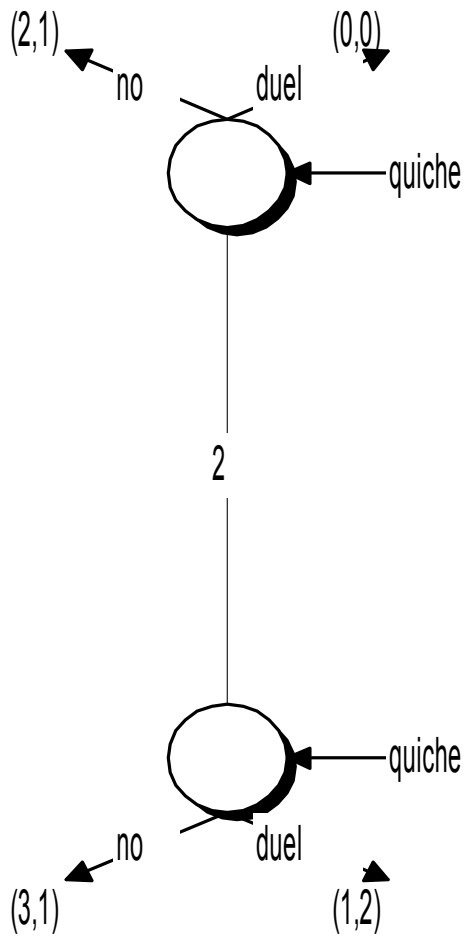
## ***Sequential Optimality***

given beliefs we have a well-defined decision problem at each information set; can define optimality at each information set

A sequential equilibrium is a behavior strategy profile  $\pi$  and an assessment  $a_i$  for each player such that  $(a_i, \pi_{-i}^i)$  is consistent and each player optimizes at each information set

# Signaling

Cho-Kreps [1987]



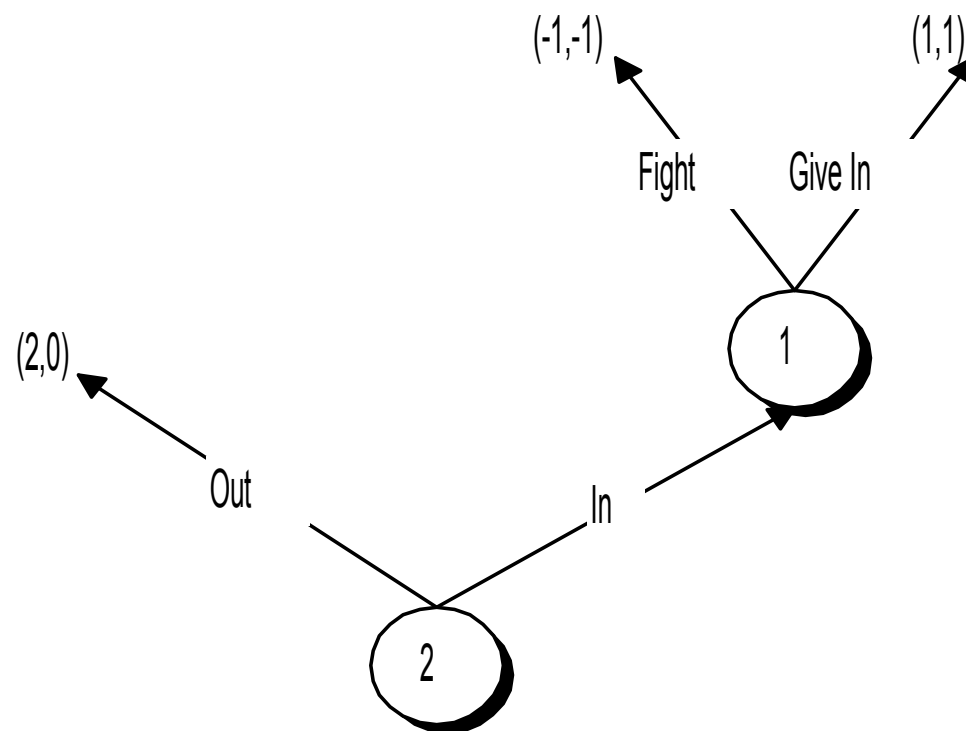
## *Types of Equilibrium*

sequential vs. trembling hand perfect

pooling and separating

## Chain Store Paradox

Kreps-Wilson [1982], Milgrom-Roberts [1982]



finitely repeated model with long-run versus short-run

## *Reputational Model*

two types of long-run player  $\omega \in \Omega$

“rational type” and “committed type”

“committed type” will fight no matter what

types are privately known to long-run player, not known to short run player

Kreps-Wilson; Milgrom-Roberts

Solve for the sequential equilibrium; show that at the time-horizon grows long we get no entry until near the end of the game

“triumph of sequentiality”

## *The Holdup Problem*

- ◆ Chari-Jones, the pollution problem
- ◆ problem of too many small monopolies

$\rho$  is the profit generated by an invention with a monopoly with a patent, drawn from a uniform distribution on  $[0, 1]$ , private to the inventor

$\varphi^F$  is the fraction of this profit that can be earned without a patent

To create the invention requires as input  $N$  other existing inventions

It costs  $\epsilon/N$  to make copies of each of these other inventions, where  $\epsilon < 1/2$  and  $\epsilon/\varphi^F < 1$

## ***Case 1: Competition***

if  $\varphi^F \rho \geq \epsilon$  the new invention is created, probability is  $1 - \epsilon/\varphi^F$ .

## Case 2: Patent

Each owner of the existing inventions must decide a price  $p_i$  at which to license their invention;  $\varphi N$  current inventions are still under patent

Subgame Perfection/Sequentiality implies that the new invention is created when  $\varphi \rho \geq \sum_i p_i$

Profit of a preexisting owner  $(1 - \frac{(\varphi N - 1)p + p_i}{\varphi})p_i$

FOC  $1 - \frac{(\varphi N - 1)p + 2p_i}{\varphi} = 0$

unique symmetric equilibrium  $p = \varphi / (\varphi N + 1)$  ;

$$\sum_i p_i / \varphi = \varphi N p / \varphi$$

corresponding probability of invention is  $1 / (\varphi N + 1)$

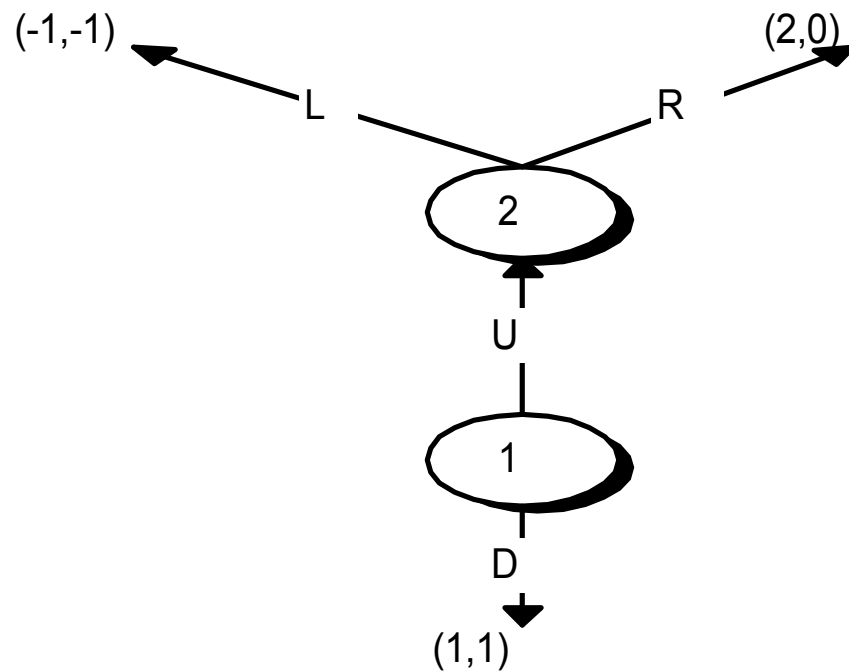


## *Robustness*

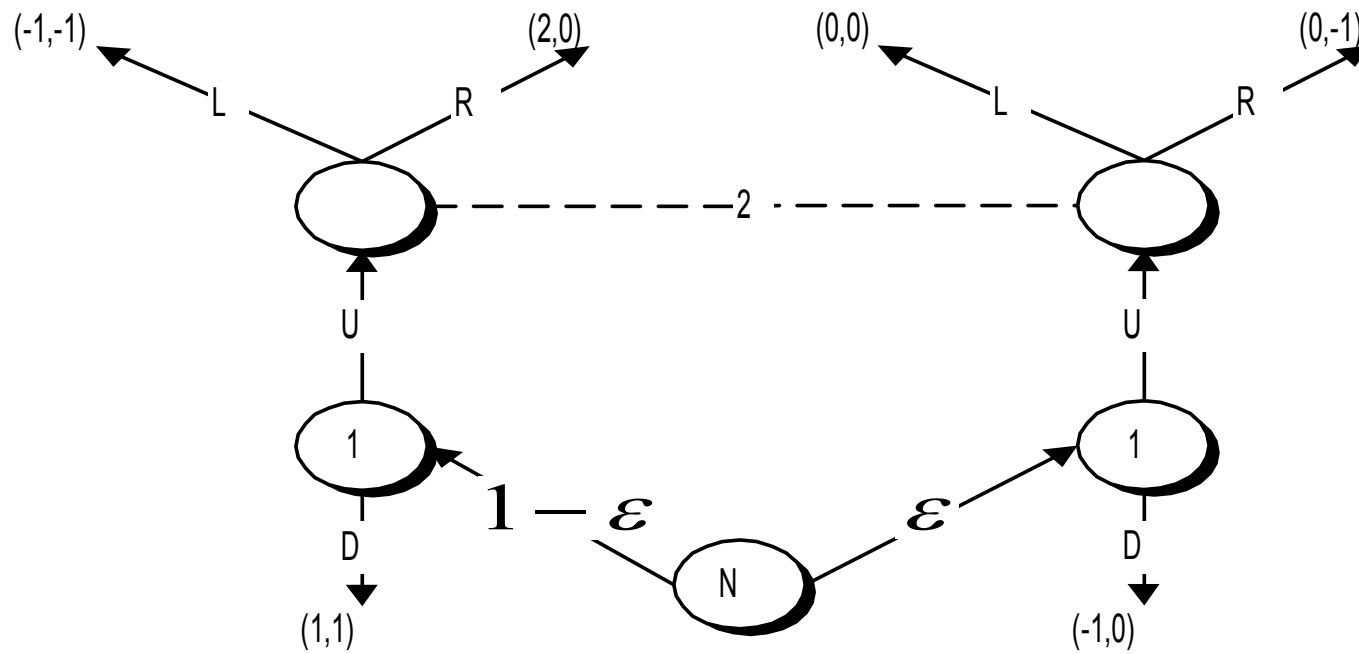
genericity in normal form games

example of Selten extensive form game

Fudenberg, Kreps, Levine [1988]



## *elaborated Selten game*



## *normal form of elaborated Selten game*

	L	R
$D_L D_R$	$1 - 2\varepsilon, 1 - \varepsilon$	$1 - 2\varepsilon, 1 - \varepsilon$
$D_L U_R$	$1 - \varepsilon, 1 - \varepsilon^{**}$	$1 - \varepsilon, 1 - 2\varepsilon$
$U_L D_R$	$-1, -1 + \varepsilon$	$2 - 3\varepsilon, 0$
$U_L U_R$	$-1 + \varepsilon, -1 + \varepsilon$	$2 - 2\varepsilon, -\varepsilon$

## ***Mechanism Design: An “auction” problem***

- Single seller has a single item
- Seller does not value item
- Two buyers with independent valuations

$0 \leq v^l < v^h$  low and high valuations

$\pi^l + \pi^h = 1$  probabilities of low and high valuations

## *what is the best way to sell the object*

- Auction
- Fixed price
- Other

## *The Revelation Principle*

Design a game for the buyers to play

- Auction game
- Poker game
- Etc.

Design the game so that there is a Nash equilibrium that yields highest possible revenue to the seller

The revelation principle says that it is enough to consider a special game

- strategies are “announcements” of types
- the game has a “truthful revelation” equilibrium

## ***In the Auction Environment***

Fudenberg and Tirole section 7.1.2

$q^l, q^h$  probability of getting item when low and high

$p^l, p^h$  expected payment when low and high

*individual rationality constraint*

$$(IR) \quad q^i v^i - p^i \geq 0$$

- if you announce truthfully, you get at least the utility from not playing the game

*incentive compatibility constraint*

$$(IC) \quad q^i v^i - p^i \geq q^{-i} v^i - p^{-i}$$

- you gain no benefit from lying about your type

the incentive compatibility constraint is the key to equilibrium



## ***Other constraints***

$q^l, q^h$  probability of getting item when low and high  
they can't be anything at all:

probability constraints

$$(1) 0 \leq q^i \leq \pi^{-i} + \pi^i / 2$$

(win against other type, 50% chance of winning against self)

$$(2) \pi^l q^l + \pi^h q^h \leq 1/2$$

(probability of getting the good before knowing type less than 50%)

## ***Seller Problem***

Maximize seller utility  $U = \pi^l p^l + \pi^h p^h$

Subject to IC and IR

To solve the problem we make a guess:

IR binds for low value

$$q^l v^l - p^l = 0$$

IC binds for high value

$$q^h v^h - p^h = q^l v^h - p^l$$

## ***The solution***

$$p^l = q^l v^l \text{ from low IR}$$

substitute into high IC

$$p^h = (q^h - q^l)v^h + q^l v^l$$

plug into utility of seller

$$U = \pi^l q^l v^l + \pi^h ((q^h - q^l)v^h + q^l v^l)$$

$$U = q^l (\pi^l v^l - \pi^h v^h + \pi^h v^l) + \pi^h q^h v^h$$

$$\pi^l + \pi^h = 1 \text{ so}$$

$$U = q^l (v^l - \pi^h v^h) + \pi^h q^h v^h$$

**Case 1:**  $v^l > \pi^h v^h$

$$U = q^l (v^l - \pi^h v^h) + \pi^h q^h v^h$$

$$(1) 0 \leq q^i \leq \pi^{-i} + \pi^i / 2$$

$$(2) \pi^l q^l + \pi^h q^h \leq 1/2$$

Make  $q^l, q^h$  large as possible so  $\pi^l q^l + \pi^h q^h = 1/2$

$$U = \frac{1/2 - \pi^h q^h}{\pi^l} (v^l - \pi^h v^h) + \pi^h q^h v^h$$

$$U = \frac{1}{2\pi^l} (v^l - \pi^h v^h) + q^h \frac{\pi^h}{\pi^l} (v^h - v^l)$$

## ***Finish of Case 1***

so  $q^h$  should be as large as possible

$$q^h = \pi^l + \pi^h / 2$$

plug back into (2) to find

$$q^l = \pi^l / 2$$

expected payments

$$p^l = q^l v^l, p^h = (q^h - q^l) v^h + q^l v^l$$

$$p^l = v^l \pi^l / 2, p^h = v^h / 2 + \pi^l v^l / 2$$

## ***Implementation of Case 1***

modified auction: each player announces their value

the highest announced value wins; if there is a tie, flip a coin

if the low value wins, he pays his value; if the high value wins he pays

$$\frac{p^h}{q^h} = \frac{v^h / 2 + \pi^l v^l / 2}{\pi^l + \pi^h / 2}$$

under these rules

probability that high type wins is  $q^h = \pi^l + \pi^h / 2$

probability that low type wins is  $q^l = \pi^l / 2$

just as in the optimal mechanism;

this means the expected payments are the same too

**Case 2:**  $v^l < \pi^h v^h$

$$U = q^l(v^l - \pi^h v^h) + \pi^h q^h v^h$$

$$(1) 0 \leq q^i \leq \pi^{-i} + \pi^i / 2$$

$$(2) \pi^l q^l + \pi^h q^h \leq 1/2$$

Make  $q^h$  large as possible,  $q^l$  as small as possible

$$q^h = \pi^l + \pi^h / 2$$

$$q^l = 0$$

expected payments

$$p^l = q^l v^l, p^h = (q^h - q^l)v^h + q^l v^l$$

$$p^l = 0$$

$$p^h = (\pi^l + \pi^h / 2)v^h$$



## ***Implementation of Case 2***

set a fixed price equal to the highest valuation

$$v^h = \frac{p^h}{q^h} = \frac{(\pi^l + \pi^h / 2)v^h}{\pi^l + \pi^h / 2}$$

## Information Aggregation in Auctions

(based on Phil Reny's slides)

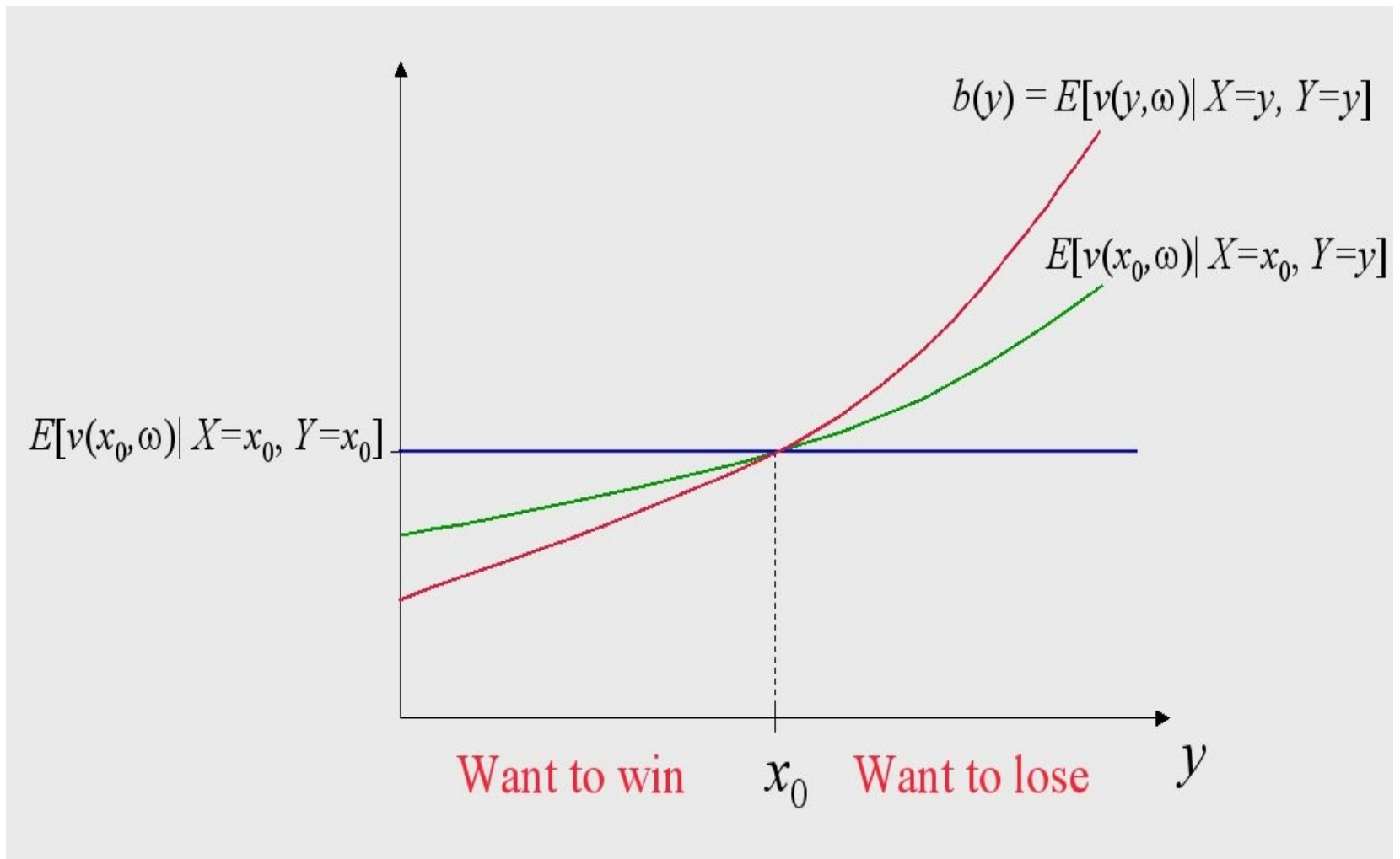
(Wilson, *Restud* (1977), Milgrom, *Econometrica* (1979, 1981))

- ◆  $n$  bidders, single indivisible good, 2<sup>nd</sup>-price auction
- ◆ state of the commodity,  $\omega \sim g(\omega)$ , drawn from  $[0,1]$
- ◆ signals,  $x \sim f(x|\omega)$ , drawn indep. from  $[0,1]$ , given  $\omega$
- ◆ unit value,  $v(x,\omega)$ , nondecreasing (strict in  $x$  or  $\omega$ )
- ◆  $f(x|\omega)$  satisfies strict MLRP:

$$x > y \Rightarrow \frac{f(x | \omega)}{f(y | \omega)} \text{ strictly } \uparrow \text{ in } \omega$$

## *Finding the Equilibrium*

- ◆ Equilibrium:  $b(x) = E[v(x, \omega) | X=x, Y=x]$   
( $X$  is owner's signal,  $Y$  is highest signal of others)
- ◆ Claim:  $b(x) = E[v(x, \omega) | X=x, Y=x]$  is an equilibrium.
- ◆ Suppose signal is  $x_0$ . Is optimal bid  $E[v(x_0, \omega) | X=x_0, Y=x_0]$ ?



## ***Assessing the Equilibrium***

- ◆ Equilibrium:  $b(x) = E[v(x, \omega) | X=x, Y=x]$   
( $X$  is owner's signal,  $Y$  is highest signal of others)
- ◆ outcome efficient for all  $n$
- ◆ Equilibrium Price:  $P = E[v(z, \omega) | X=z, Y=z]$ ,  
where  $z$  is the 2<sup>nd</sup>-highest signal.
- if  $\omega$  is  $U[0, 1]$  and  $x$  is  $U[0, \omega]$ , then  $P \rightarrow v(\omega, \omega)$   
the competitive limit, and information is aggregated.  
(fails if conditional density is continuous and positive.)

## ***Principal-Agent Problem***

A risk neutral principal

A risk averse agent with utility  $u(c)$ , where  $u(0) = 0, u(v) = 1$

Agent may take one of two actions  $e = 0,1$  (effort level)

Total utility of agent is  $u(w) - e$  where  $w$  is payment from principal

Two possible output levels  $0, y$  accrue to the principal

If agent takes effort  $e = 0$  then probability of  $y$  output is  $\pi_0 > 0$ ; if agent takes effort  $e = 1$  then probability is  $1 > \pi_1 > \pi_0$

Assume that  $\pi_1 y - 1 > \pi_0 y$  so that it is efficient for the agent to make an effort

Agent's reservation utility is 0

## ***With complete observability***

Maximize principal's utility

Pay the agent a fixed fee of  $v$  if he provides effort, nothing if he does not. So agent is indifferent gets  $u(v) - 1 = 0$  if effort,  $u(0) = 0$  if no effort. So he is willing to provide effort, but not if he is paid less

## ***With incomplete observability***

Principal only observes output, pays  $w_y, w_0$

Incentive constraint for agent:

$$\pi_1 u(w_y) + (1 - \pi_1)u(w_0) - 1 \geq \pi_0 u(w_y) + (1 - \pi_0)u(w_0)$$

individual rationality constraint for agent:

$$\pi_1 u(w_y) + (1 - \pi_1)u(w_0) - 1 \geq 0$$

Principal may pay 0, get 0, or minimize  $\pi_1 w_y + (1 - \pi_1)w_0$  subject to these constraints

Rewrite IC

$$(\pi_1 - \pi_0)[u(w_y) - u(w_0)] \geq 1$$

implies IR constraint must hold with equality, since otherwise could lower  $w_0$  while maintaining IC



$$\text{IR } \pi_1 u(w_y) + (1 - \pi_1)u(w_0) - 1 = 0$$

$$\text{objective function } \pi_1 w_y + (1 - \pi_1)w_0 = c$$

$$\text{IC } (\pi_1 - \pi_0)[u(w_y) - u(w_0)] \geq 1$$

$$w_y = \frac{c - (1 - \pi_1)w_0}{\pi_1} \text{ [from objective function]}$$

substitute objective into IR

$$\pi_1 u\left(\frac{c - (1 - \pi_1)w_0}{\pi_1}\right) + (1 - \pi_1)u(w_0) - 1 = 0$$

differentiate

$$\begin{aligned} \frac{dc}{dw_0} &= -\frac{-\pi_1(1 - \pi_1)u'(w_y) + (1 - \pi_1)u'(w_0)}{\pi_1 u'(w_y)} \\ &= -\frac{(1 - \pi_1)[u'(w_0) - \pi_1 u'(w_y)]}{\pi_1 u'(w_y)} \leq 0 \end{aligned}$$

non-negative since  $w_y \geq w_0$  implies  $u'(w_0) \geq u'(w_y)$

because  $\frac{dc}{dw_0} \leq 0$  should increase  $w_0$  until the IC binds

combining the IC binding with the IR

$$(\pi_1 - \pi_0)(1 - u(w_0)) = \pi_1$$

which is possible only if  $u(w_0) < 0$ , that is  $w_0 < 0$

notice that IC implies  $w_y > w_0$  so no full insurance

what if constrained to  $w_0 \geq 0$ ? (“limited liability *ex post*”)

The constraint binds, so optimum has  $w_0 = 0$

(IC)  $(\pi_1 - \pi_0) u(w_y) \geq 1$

(IR)  $\pi_1 u(w_y) \geq 1$  does not bind if (IC) holds

so objective is to minimize  $\pi_1 w_y$  subject to IC

namely IC should bind  $(\pi_1 - \pi_0) u(w_y) = 1$

agent earns an “informational” rent because IR does not bind

since IC binds, still have  $w_y > w_0$  and no full insurance

## ***Macro Mechanism Design: The Insurance Problem***

Kehoe, Levine and Prescott [2000]

continuum of traders ex ante identical

two goods  $j = 1, 2$

$c_j$  consumption of good  $j$

utility is given by  $\tilde{u}_1(c_1) + \tilde{u}_2(c_2)$

each household has an independent 50% chance of being in one of two states,  $s = 1, 2$

endowment of good 1 is state dependent

$$\omega_1(2) > \omega_1(1)$$

endowment of good 2 fixed at  $\omega_2$ .

In the aggregate: after state is realized half of the population has high endowment half low endowment

## ***Gains to Trade***

after state is realized

low endowment types purchase good 1 and sell good 2

before state is realized

traders wish to purchase insurance against bad state

unique first best allocation

all traders consume  $(\omega_1(1) + \omega_1(2))/2$  of good 1, and  $\omega_2$  of good 2.

## ***Private Information***

idiosyncratic realization private information known only to the household

first best solution is not incentive compatible

low endowment types receive payment

$$(\omega_1(2) - \omega_1(1)) / 2$$

high endowment types make payment of same amount

high endowment types misrepresent type to receive rather than make payment

## ***Incomplete Markets***

prohibit trading insurance contracts

consider only trading ex post after state realized

resulting competitive equilibrium

- equalization of marginal rates of substitution between the two goods for the two types
- low endowment type less utility than the high endowment type

## ***Mechanism Design***

purchase  $x_1(1) > 0$  in exchange for  $x_1(2) < 0$

no trader allowed to buy a contract that would later lead him to misrepresent his state

assume endowment may be revealed voluntarily, so low endowment may not imitate high endowment

incentive constraint for high endowment

$$\begin{aligned} & \tilde{u}_1(\omega_1(2) + x_1(2)) + \tilde{u}_2(\omega_2 + x_2(2)) \\ & \geq \tilde{u}_1(\omega_1(2) + x_1(1)) + \tilde{u}_2(\omega_2 + x_2(1)) \end{aligned}$$

- Pareto improvement over incomplete market equilibrium possible since high endowment strictly satisfies this constraint at IM equilibrium

Need to monitor transactions



## ***Lotteries and Incentive Constraints***

one approach:  $X$  space of triples of net trades satisfying incentive constraint

use this as consumption set

enrich the commodity space by allowing sunspot contracts (or lotteries)

1)  $X$  may fail to be convex

2) incentive constraints can be weakened - they need only hold on average

$$\begin{aligned} E \big|_2 \tilde{u}_1(\omega_1(2) + x_1(2)) + \tilde{u}_2(\omega_2 + x_2(2)) \\ \geq E \big|_1 \tilde{u}_1(\omega_1(2) + x_1(1)) + \tilde{u}_2(\omega_2 + x_2(1)) \end{aligned}$$

## ***Other Applications of Mechanism Design***

- general equilibrium theory
- public goods
- taxation
- price discrimination

## ***Common versus Individual Punishment***

$N$  choose  $a_i \in \{0, 1\}$  effort to contribute to a public good (equals cost)

no effort, no input  $y_i = 0$

effort, probability  $1 - \pi$  of input

let  $M$  be the number who contribute, then contributors get

$$(M(1 - \pi)/N)V - 1$$

non-contributors get

$$(M(1 - \pi)/N)V$$

where  $V(1 - \pi) > 1$

suppose also that  $V(1 - \pi)/N < 1$  so no voluntary contributions

## ***Crime and Punishment***

A punishment  $P$

common punishment: if the punishment occurs everyone is punished  
(will cancel future public goods projects...)

individual punishment: each individual may be punished or not  
separately

## ***Common Punishment under Certainty***

$$\pi = 0$$

if everyone contributes no punishment

otherwise punishments

incentive compatibility

$$V - 1 \geq ((N - 1)/N)V - P$$

or

$$P \geq 1 - V/N$$

expected cost of the punishment is zero

## ***Common Punishment under Uncertainty***

Probability someone doesn't contribute is  $1 - \pi^N$

incentive compatibility

$$V(1 - \pi) - 1 - (1 - \pi^{N-1})P \geq ((N - 1)/N)(1 - \pi)V - P$$

or

$$P \geq (1 - V(1 - \pi)/N)/\pi^{N-1}$$

expected cost of punishment

$$(1 - \pi^N)(1 - V(1 - \pi)/N)/\pi^N$$

goes to infinity as  $N \rightarrow \infty$

## ***Theorem (Fudenberg, Levine and Pesendorfer)***

People are always trying to figure a way around this  
(perpetual motion machine of economics)

Suppose that  $P$  is bounded above

for any mechanism public good production goes to zero as  $N \rightarrow \infty$

## *Individual Punishment*

Punish if  $y_i = 0$

incentive constraint

$$V(1 - \pi) - 1 - \pi P \geq ((N - 1)/N)V(1 - \pi) - P$$

or

$$P \geq (1 - V(1 - \pi)/N)/(1 - \pi)$$

with expected cost of punishment

$$\pi(1 - V(1 - \pi)/N)/(1 - \pi)$$

less than  $V(1 - \pi) - 1$  then produce the public good