

## Arrow's Theorem

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Alternatives  $A$

Agents  $N = \{1, \dots, n\}$

$\succ_i \in L(A)$  total order on  $A$

$a \succ_i b$   $i$  prefers  $a$  to  $b$

SWF  $F: L(A)^n \rightarrow L(A)$

SCF  $f: L(A)^n \rightarrow A$

### Properties

(U) unanimity  $F(\succ \succ \dots \succ) = \succ$

(IIA) For every  $a, b \in A$ , every  $\succ_1, \dots, \succ_n, \succ'_1, \dots, \succ'_n$ ,  
 $a \succ_i b \Leftrightarrow a \succ'_i b$  for all  $i$  implies  $a \succ_F b \Leftrightarrow a \succ'_F b$

(ND) non dictatorial; no  $i$  s.t.  $F(\succ_1, \dots, \succ_n) = \succ_i$  for  
all  $\succ_1, \dots, \succ_n \in L(A)$

Thm If  $|A| \geq 3$ , every SWF that is (U) and (IIA) is (Dictatorial)

(WP) For every  $a, b \in A$ , if  $a \succ_i b$  for all  $i$  then  $a \succ_F b$

Lemma (U) and (IIA)  $\Rightarrow$  (WP)

Proof of Arrow's thm via Geanakoplos' 05 "first proof"

## Extremal lemma

(2)

If every  $i$  puts  $b$  at bottom or top of  $\langle i$  then any (IA) and (WP) SWF must put  $b$  at bottom or top.

Proof By contradiction, suppose  $c \prec_F b$ ,  $b \prec_F a$ .

By IA, unchanged if more  $c$  above  $a$  for all  $i$ . By (WP) need  $a \prec_F c$ , contradiction.

Eg. 
$$\begin{array}{cccc|c} b & b & a & & a \\ c & a & c & & b \\ a & c & b & & c \\ & & & & F \end{array} \rightarrow \begin{array}{cccc|c} b & b & c & & a \\ c & c & a & & b \\ a & a & b & & c \\ & & & & F \end{array} \begin{array}{l} \text{(by IA) ... but} \\ \text{fails (WP)} \end{array}$$

## Extremely Pivotal lemma

For any  $b$ , exists  $\langle_1 \dots \langle_n$  for which an agent  $i$  is extremely pivotal and can move  $b$  from bottom to top.

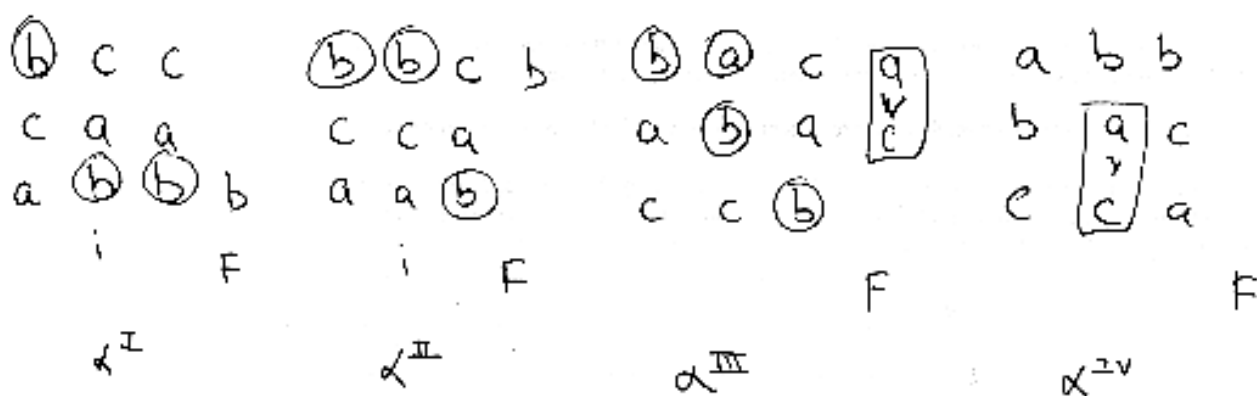
Proof 
$$\left. \begin{array}{cccc} \{ & \{ & \{ & \\ b & b & b & b \\ & & & F \end{array} \right\} \rightarrow \dots \rightarrow \left. \begin{array}{cccc} b & b & b & b \\ \{ & \{ & \{ & \\ & & & F \end{array} \right\}$$

By (WP) By (WP)

Switch  $b$  bottom to top one-by-one; eventually get extreme pivot.

# Proof of Arrow's Theorem

(3)



1. Show agent  $i$  from extremely pivotal lemma is a dictator for any pair  $a, c$  not involving  $b$ . Construct  $\alpha^{III}$  by moving  $a$  above  $b$  in  $\alpha^I$ , then by IIA have  $b \prec_F a$  from  $\alpha^I$  and  $c \prec_F b$  from  $\alpha^{II}$ . So,  $c \prec_F a$ . Construct  $\alpha^{IV}$  by changing anything but  $c, a$  relation for all agents. So,  $c \prec_F a$  by IIA and now all preferences arbitrary except  $a \succ c$  for agent  $i$ .

2. Show  $i$  is dictator for any pair  $a, b$ . Consider third outcome,  $c$ . Some  $j$  is a dictator for any  $\{\alpha, \beta\}$  not including  $c$ , including  $\{a, b\}$ . But  $i$  controls  $\{a, b\}$  from  $\alpha^I$  to  $\alpha^{II}$  and  $j$  must be  $i$ .

# Muller-Satterthwaite Theorem

[4]

If  $|A| \geq 3$ , any SCF that satisfies (U) and (M) is dictatorial.

Agent  $i$  always gets top choice

If all agree on top choice, must pick.

$f(x_1, \dots, x_n) = a$   
 $\neq a' = f(x_1, \dots, x_i', \dots, x_n)$   
then  
 $a \succ_i a$  and  
 $a \succ_i a'$

(SP) SCF  $f$  is (SP) if  
 $a = f(x_1, \dots, x_n) \succ_i f(x_1, \dots, x_i', \dots, x_n) = a'$   
for all  $x_1, \dots, x_n, x_i'$

Proof via using  $f$  to construct SWF  $\neq$  violating Arrow's thm.

Lemma Monotonic  $\Leftrightarrow$  SP

## Gibbard-Satterthwaite thm

If  $|A| \geq 3$ , any SCF that is (SP) and onto must be (Dictatorial)

Lemma (Onto) and (SP)  $\Rightarrow$  (U)

Follows as a corollary of ~~the~~ Muller-Satterthwaite

## How to escape?

Structured preferences

Add money / QL

Single-peaked prefs

House allocation

Two sided matching

# Utility theory

C T S D M C

exists  $u_i : O \rightarrow [0,1]$  s.t.  $u_i(o_1) \geq u_i(o_2) \Leftrightarrow o_1 \succeq o_2$   
 $u_i(\text{lottery}) = \text{exp. util.}$

## B. Normal form game

	P	H
W	2,1	0,0
L	0,0	1,2

$2p + 0(1-p) = 0p + 1(1-p) \Leftrightarrow p = 1/3$   
 $q = 2/3$

2/9	4/9
1/9	2/9

Payoff  $\frac{4}{9} \times \frac{3}{2} = \frac{2}{3}$

- Mixed - randomizing
- belief about play of others
  - large + random matching

$(N, A, u)$

$u_i : A \rightarrow \mathbb{R}$   
 strategy independence

$s_i \in \Delta(A_i)$

$u_i(s_1, \dots, s_n) = \sum_{a \in A_1 \times \dots \times A_n} u_i(a_1, \dots, a_n) \prod_j s_j(a_j)$

Defn.

$s^*$  is NE if  $u_i(s_i^*, s_{-i}^*) \geq u_i(s_i, s_{-i}^*)$   
 $\forall i, \forall s_i$

## C. Existence

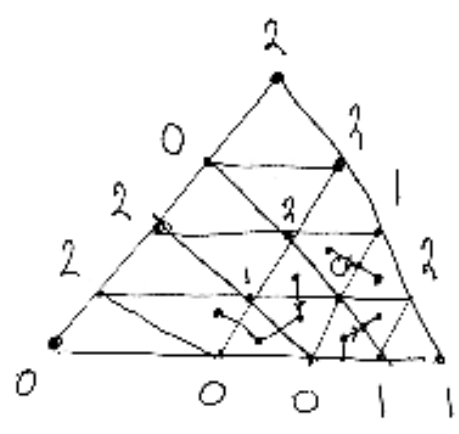
Sperner's Lemma

Simplex  $T_n = \overline{\text{conv}}_{\mathbb{R}^{n+1}} \{x^0, \dots, x^n\}$ ,  $\sum \lambda_i = 1, \lambda_i \geq 0$   
 $T_n \subseteq \mathbb{R}^{n+1}$   
 tile, intersect on entire face  
 with proper labeling  $h$  has odd # completely labeled subsimplexes.

$L: V \rightarrow \{0, \dots, n\}$   
 $L(v) \in X(v)$   
 support

induction on  $n$ . Base case  $n=0$  trivial.

one subtriangle, one level, ...



Uniquely defined.  
Either complete or one exit.

odd # of subtriangles. Walk, either unique + get back or get complete.

Any not reached must pair. Can't go back to edge.

Brouwer Fixpoint Theorem  $f \in \mathbb{R}^{m+1}$   $[f_i = 1 \quad f_i \geq 0$

$f: \Delta_m \rightarrow \Delta_m$ , continuous. Exist  $z$  s.t.  $f(z) = z$ .

Construct  $\epsilon$ -simplicial subdivision

$$k(\epsilon) \in X(\epsilon) \cap \{i: f_i(\epsilon) \leq \epsilon_i\}$$

NB: can't all go larger else  $\sum \epsilon_i = 1$  and  $\sum f_i(\epsilon) > 1$ .

Let  $\epsilon \rightarrow 0$ , consider subsequence of, converges, ...

$\Rightarrow$  (complete)

$$f_i(z) = z_i \text{ for all } i$$

$$\left[ \begin{matrix} f_i(z) = 1 \\ \sum z_i = 1 \end{matrix} \right] \dots \left[ f_i(z) = z_i \right] \text{ Fixpoint.}$$

Extend BFP to simple game  $\Delta(s_1) \times \dots \times \Delta(s_n)$  (7)

Define  $f: S \rightarrow S$  s.t. fix point  $\equiv$  NE via function that puts more prob weight on better response.

D. Regret  $(a_i, a_i)$

Max Regret  $\max_{a_i} \text{Regret}(a_i, a_i)$

Minimax Regret  $\min_{a_i} [ \text{---} ]$

Safety-level strategies

Tennenhof, Borkhoj, Pan & Halpern

E. Corr. Equil  $\supseteq$  NE ... exist

continuous (convex cont.)

$s_i: D_i \rightarrow A_i$   $\pi(d_1, \dots, d_n)$  common

~~$u_i(s_i^*(d_i), s_{-i}^*(d_{-i})) \geq u_i(s_i(d_i), s_{-i}^*(d_{-i}))$~~

exp. utility  $\mathbb{E}_{d_{-i}} [u_i(s_i^*(d_i), s_{-i}^*(d_{-i})) | \pi, d_i] \geq \mathbb{E}_{d_{-i}} [u_i(s_i(d_i), s_{-i}^*(d_{-i}))]$

0.5	0
0	0.5

same signal.

Payoff 1.5

{Why}

LP solve (even concave)

learning

THPE

$\epsilon$ -Nash

Selten

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$$\left. \begin{array}{l} 1,1 \quad 0,0 \\ 1+\frac{\epsilon}{2}, 1 \quad 500,500 \end{array} \right\} \text{Problem}$$

refinement:

Must remain BR to each of a fully mixed convergent sequence

$$s_i \text{ BR to } s_{-i}^k \quad s^0, s^1, s^2, \dots \quad \lim_{k \rightarrow \infty} s^k = s$$

$$\begin{array}{cc} & L & R \\ U & 1,1 & 2,0 \end{array}$$

(From Wikipedia)

$$D \quad 0,2 \quad 2,2$$

(U,L) (D,R) NE

↑  
THPE

↳ In fact, player 2 will switch away from R

Extension from THPE

↳ none at all info sets

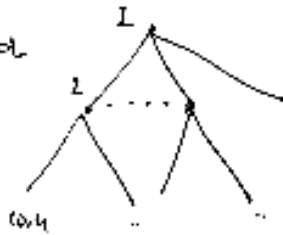


# Extensive form

perfect



imperfect



SPNE.

Via backwards induction.

SE.

fully mixed

$$(S, \mu) = \lim_{n \rightarrow \infty} (S^n, \mu^n)$$

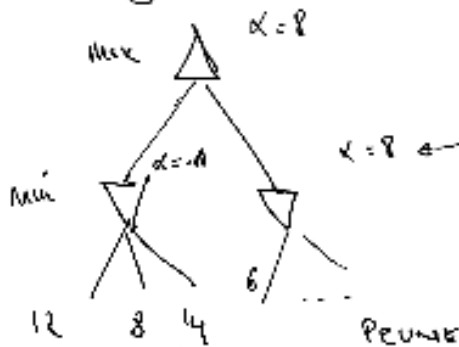
$S_i$  is BR for  $i$  given  $\mu$

Removes beliefs that are "incredible" ...

threats (puts some prob. everywhere)

$\alpha$ - $\beta$  pruning

zero-sum game



what can achieve just above

## H. Repeated Game

Why do we see cooperation (g. PD). Punishment!

NE exist that support ~~W.W.W~~  $\tau_1 \dots \tau_n$

(i) ~~feasible~~ ~~enforceable~~  $v_i \geq \min \max_i$  PUNISH

(ii) feasible  $v_i$  achievable via average of cycling ...

+ Discounting, Perfect, ...

# A. Games of Incomplete Information

$$(N, X_1, \dots, X_n, \Theta_1, \dots, \Theta_n, u_1, \dots, u_n)$$

g. actions

$$u_i: X_1 \times \dots \times X_n \times \Theta_i \rightarrow \mathbb{R}$$

$$s_i: \Theta_i \rightarrow X_i$$

Dom. strat. equil.  $u_i(s_i^*(\theta_i), s_{-i}^*(\theta_{-i})) \geq u_i(s_i'(\theta_i), s_{-i}^*(\theta_{-i}))$   
 $\forall i, \forall \theta_i, \forall \theta_{-i}, \forall s_i, \forall s_i'$

Ex post Nash equil.  $u_i(s_i^*(\theta_i), s_{-i}^*(\theta_{-i})) \geq u_i(s_i'(\theta_i), s_{-i}^*(\theta_{-i}))$   
 $\forall i, \forall \theta_i, \forall \theta_{-i}, \forall s_i'$

Bayesian games

$\rightarrow$  common prior  $Pr(\theta) \in [0, 1]$  on joint types

Bayes Nash equil.  $\int_{\theta_{-i} \in \Theta_{-i}} Pr(\theta_{-i} | \theta_i) u_i(s_i^*(\theta_i), s_{-i}^*(\theta_{-i}), \theta_i) \geq$   
 $\int_{\theta_{-i} \in \Theta_{-i}} Pr(\theta_{-i} | \theta_i) u_i(s_i'(\theta_i), s_{-i}^*(\theta_{-i}), \theta_i)$   
 $\forall i, \forall \theta_i, \forall s_i'$

Common prior

Aumann: People with same info have "no rational basis" for different priors

Posterior may differ through info. acquisition

$\rightarrow$  if due to info processing then model directly

Morris: methodological defense

$\rightarrow$  but judiciously relax

~~is~~  $\rightarrow$  Becomes important in MAS because need to make inferences on  $\theta_i$

## B. Escaping Gibbard-Satterthwaite

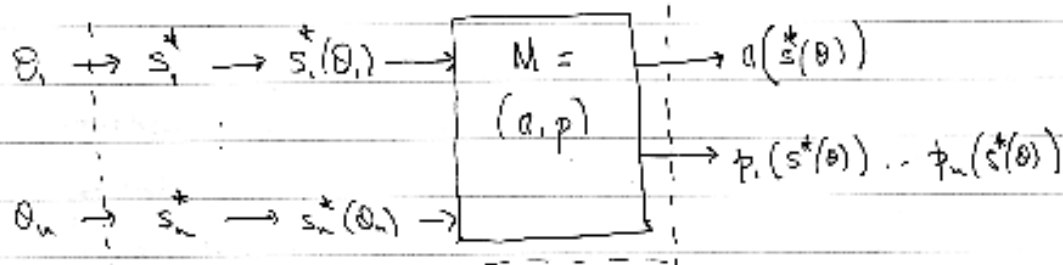
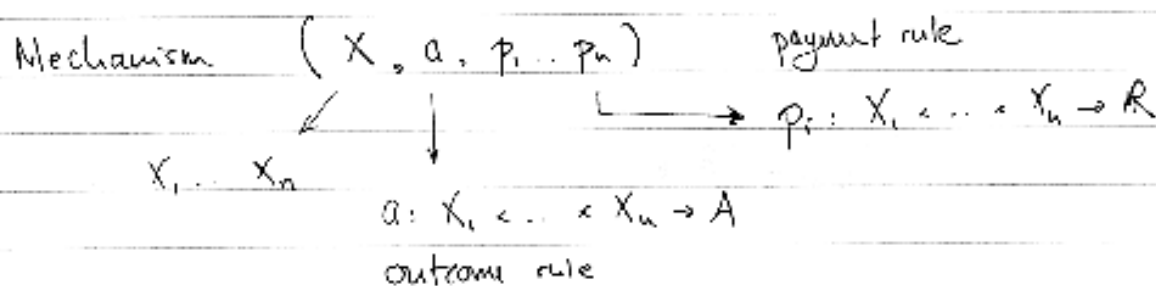
$$f: I^n \rightarrow A$$

DSIC, onto,  $|A| \geq 3$ , then dictatorial

Quasi-linear

$$v_i: A \times \Theta_i \rightarrow \mathbb{R}$$

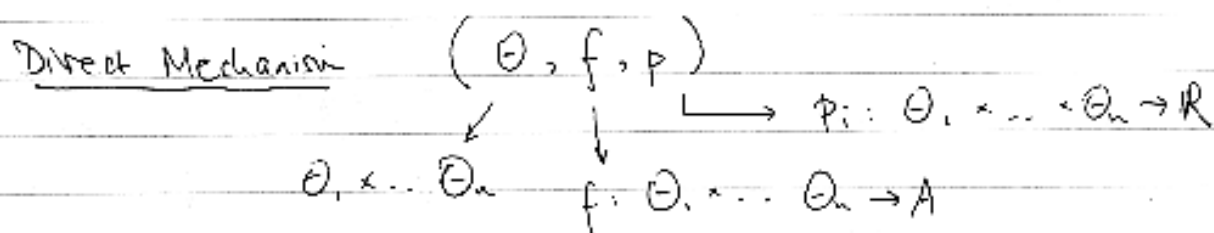
$$u_i = v_i(a, \theta_i) - m$$



$M = (a, p)$  implements  $f: \Theta_1 \times \dots \times \Theta_n \rightarrow A$  in DSE if  $f(\theta) = a(s^*(\theta))$   
 $\forall \theta$ , and  $s^*$  is a DSE.

↳ one equilibrium sufficient (!)

Revelation principle If exist  $M$  that implements  $f$  in DSE then  
exists a direct, DSIC  $M'$  that implements  $f$ .



c. Strategyproof mechanism: VCG

- ↳ Role of indirect
- ↳ SP for free (?)

Groves

$$f(\theta) = \arg \max_a \sum_i v_i(a, \theta_i)$$

$$p_i(\theta) = h_i(\theta_i) - \sum_{j \neq i} v_j(a^*, \theta_j) \stackrel{(\text{vib})}{=} \sum_{j \neq i} v_j(a^{-i}, \theta_j) - \sum_{j \neq i} v_j(a^*, \theta_j)$$

$$a^* = f(\theta) \qquad a^{-i} = f(\theta_{-i})$$

DSIC:

Fix  $\theta_{-i}$  utility  $v_i(a, \theta_i) + \sum_{j \neq i} v_j(a, \theta_j) - h_i(\theta_i)$

$$a \in \arg \max_a v_i(a, \theta_i) + \sum_{j \neq i} v_j(a, \theta_j)$$

Example

- (i) Single item auction {0, 6, 3}
- (ii) two units for sale
- (iii) ~~graph~~ lowest-cost routing



$$p_k = (W - d_{-k}) - (W - d^* + c_k) = d^* - c_k - d_k = (70 - 30) - 10 = 30$$

- (iv) (A, \$2)
- (A, \$2)
- (B, \$2)

Utility:  $\sum_j v_j(a^*, \theta_j) - \sum_{j \neq i} v_j(a^{-i}, \theta_j) \geq 0$

in social choice allocation ...

Revenue:  $\sum_{j \neq i} v_j(a^{-i}, \theta_j) - \sum_{j \neq i} v_j(a^*, \theta_j) \geq 0$

unless the externality

- Buy \$0
- Sell \$5
- 9 - 0 = 9
- 0 - 10 = -10

Generalize to  $\begin{bmatrix} \alpha_i v_i(a) + \beta(a) \\ \vdots \end{bmatrix}$

↳ Roberts: If  $|A| \geq 3$ ,  $f$  is onto  $A$ ,  $\Theta_i = \mathbb{R}^A$  for all  $i$ , then only DSIC mechanism are Groves.

**D) Strategyproof: Characterization**

~~M~~  $M = (f, p)$  is DSIC iff (for every  $i$ ):

**i)** For every  $\theta_i$ , exists  $p_a \in \mathbb{R}$  st. for all  $\theta_i$  with  $f(\theta_i, \theta_{-i}) = a$ , then  $p_i(\theta_i, \theta_{-i}) = p_a$

**ii)** For every  $\theta_i$ , every  $\theta_{-i}$ ,  $f(\theta_i, \theta_{-i}) \in \arg \max_{a \in A} (v_i(a, \theta_{-i}) - p_a)$

( $\Leftarrow$ ) Easy

( $\Rightarrow$ ) **i)** Get better price if not true

**ii)** Get better outcome if not true

↳ GSP  $\{10, 6, 3\}$

- 10 Pay 6
- 6 Pay 3
- 3 Lose

Satisfies **i)** but not **ii)** if value 2nd slot  $\neq$  1st slot

**E) Monotonicity**

WMON

$$f(\theta_i, \theta_{-i}) = a \neq b = f(\theta_i', \theta_{-i})$$

$$\Rightarrow v_i(b, \theta_{-i}') - v_i(a, \theta_{-i}') \geq v_i(b, \theta_{-i}) - v_i(a, \theta_{-i})$$

**Necessary**

$$v_i(a, \theta_{-i}') - p_a \geq v_i(b, \theta_{-i}') - p_b \quad | f(\theta_{-i}') = a$$

$$v_i(b, \theta_{-i}') - p_b \geq v_i(a, \theta_{-i}') - p_a \quad | f(\theta_{-i}') = b$$

$$\Leftrightarrow v_i(a) + v_i(b, \theta_{-i}') \geq v_i(b) + v_i(a, \theta_{-i}')$$

**WMON + Groves  $\Theta_i \Rightarrow$  DSIC**

NS Payment via graph-theoretic argument

NS  $\Theta_i = \mathbb{R}^A$   $\text{MON} \equiv \text{Affine max}$

$\Theta_i \in \mathbb{R}^A$   $\downarrow$  convex



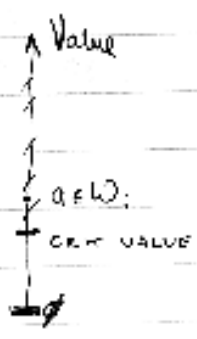
CA's  $v_i(S, \Theta_i) \geq v_i(T, \Theta_i)$  ,  $S \geq T$   
 $v_i(\emptyset, \Theta_i) = 0$   
 $\Theta_i \equiv 2^A$  numbers  
 convex space

But if structure, e.g. "double-minded" then not convex

$(AB, \$10)$   $(CD, \$20)$   $\Theta_i$   
 $(AC, \$5)$   $(BD, \$15)$   $\Theta_i'$   
 $(AB, \$5 \quad AC, \$2.50 \quad CD, \$10 \quad BD, \$7.50)$

F Single (1.5) parameter settings

$$v_i(a, \Theta_i) = \begin{cases} w_i & \text{if } a \in T_i \\ 0 & \text{otherwise} \end{cases}$$



$\text{MON} \Leftrightarrow \text{DSIC}$   
 change crit. value

Single-minded CA's

$$v_i(S, \Theta_i) = \begin{cases} w_i & \text{if } S \geq S_i \\ 0 & \text{otherwise} \end{cases}$$

$\text{DSIC} \Leftrightarrow \text{MON}$  is  $(w_i, S_i)$

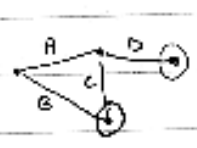
Change min  $w_i'$  at  $w_i$  of  $S_i$

type:  $(w_i, S_i)$   
 $w_i \in \mathbb{R}$   $S_i \in G$

With  $(AB, \$7) \rightarrow (A, \$7)?$   
 $\rightarrow (ABC, \$7)?$

NP-hard via reduction from ~~IND~~ INDEPENDENT SET

Given undirected graph  
~~is~~ is there a set of ~~at~~ vertices size  $\geq k$  that share no edge?



Reduces to  
 (A, B, C, D) is there a set of ~~at least~~  $\geq k$  vertices  
 an allocation of value  
 (A, B, C, D)  $\geq 1$   
 (B, C, D)  $\geq 1$   
 (A, C, D)  $\geq 1$   
 (D, C)  $\geq 1$

is NP?

NP-hard; decision problem is NP-complete.

**APPROX** c-approx  $\frac{ALG(u)}{OPT(u)} \geq \frac{1}{c}$  for all  $u$

Eg., sort & greedily allocate (10, A) Pay \$11  
 (19, AB) (22, AB) coin  
 (8, B)

Max ...  
 change critical value

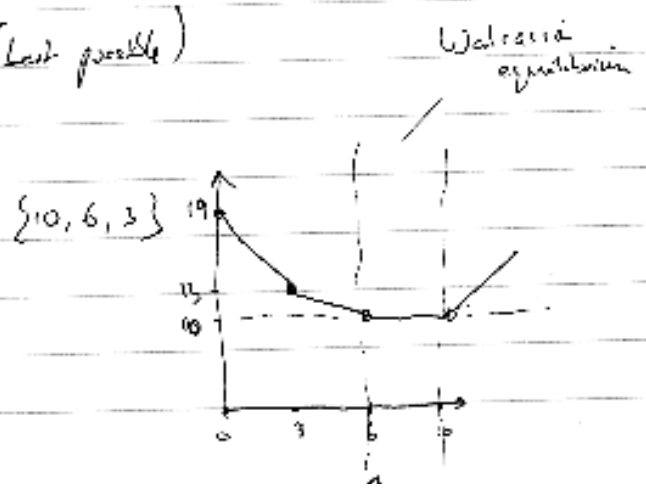
In fact, rank by  $\frac{w_i}{\sqrt{|S_i|}}$  get  $\sqrt{n}$  approx (best possible)

**LP/DUAL**

$D^* = V^*$

Max  $\sum x_i v_i$   
 s.t.  $x_i \leq 1$   $\pi_i$   
 $\sum x_i \leq 1$   $p$   
 $x_i \geq 0$

min  $p + \sum \pi_i$   
 s.t.  $p + \pi_i \geq v_i$   
 $\pi_i \geq 0$   
 ... (D.O.C.)



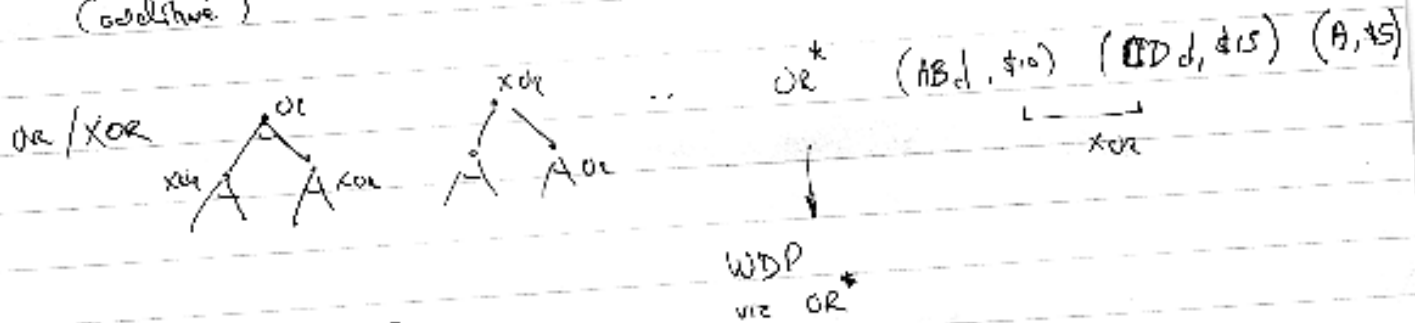
# Language

2<sup>16</sup> bundles!

Need concise + expressive

OR  
(additive)

XOR  
(unit element)



Feed into concise MIPs.

1  
2  
3

... some variables on  $Q_i$