

Attempt 3: Start with EFi allocation and make Pareto improvement.

	A	B	C	D	E
1	10	8	6	4	2
2	8	4	0	3	0

RR gives \square
which is EFi

\square is a Pareto improvement

but fails EFi.

Nash Social Welfare

The Nash Social Welfare (NSW) of an allocation A is defined as

$$NSW(A) = (v_1(A_1) v_2(A_2) \cdots v_n(A_n))^{1/n}$$

fig. 3

	A	B	C
1	4	3	2
2	5	2	2

$$NSW(O) = 4$$

$$NSW(\square) = 5$$

(Say additive valuation for this discussion)

A Nash Optimal allocation is one that maximizes Nash social welfare.

[If optimal is zero, then find any largest set of agents who can simultaneously be given positive utility and maximize the geometric mean ~~with~~ w.r.t. only those agents]

Any Nash optimal allocation satisfies $EF1 + PO$.
 (Caragiannis et al. 2016)

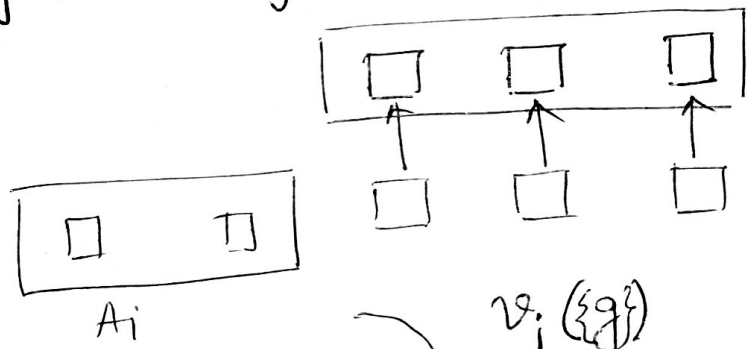
Proof: PO: Pareto improvement improves NSW.
 If an allocation is not PO \Rightarrow not NSW maximizing

EF1: Suppose A is a Nash optimal allocation.

But A is not $EF1$. Will show it can't be Nash optimal either. Will construct another allocation that beats it in NSW.

$\neg EF1 \Rightarrow \exists i, j$ s.t. $\forall x_j \in A_j$
 $v_i(A_i) < v_i(A_j \setminus \{x_j\})$

dropping any item from j 's bundle doesn't make i 's envy towards j vanish.



A_j
 value of i for items in A_j
 $\frac{v_j(\{g\})}{v_i(\{g\})}$
 value ratio for $\{g\}$
 [bang-per-buck]

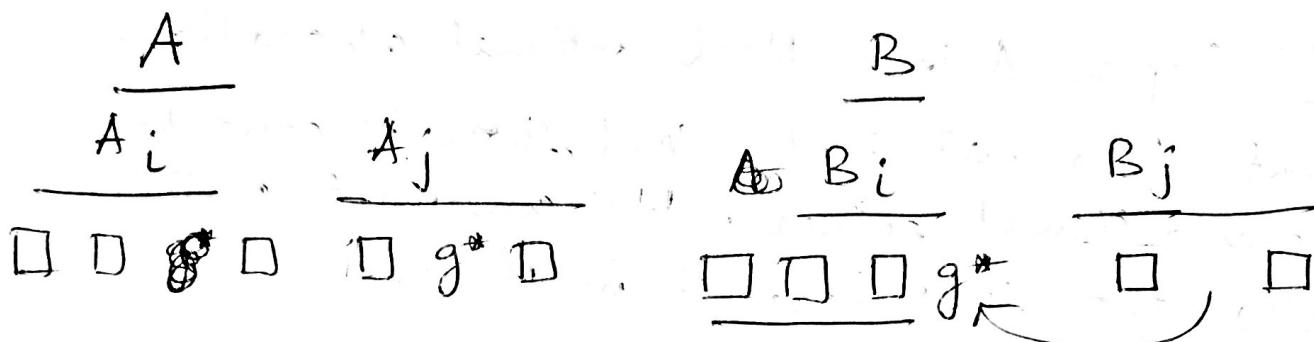
define $g^* \in \operatorname{argmin}_{g \in A_j: v_i(\{g\}) > 0}$

Existence of such a g^* is guaranteed.
 If all $g \in A_j$ were $v_i(\{g\}) = 0$, then i wouldn't envy A_j .

In fig 3, for $i=2$, under \square , $g^* = c$.

Claim: Transfer of g^* from A_j to A_i improves NSW.

[hence contradicts that A was Nash optimal]



Because of additivity:

$$v_i(B_i) = v_i(A_i) + v_i(g^*)$$

$$v_j(B_j) = v_j(A_j) - v_j(g^*)$$

$$\text{TST: } \text{NSW}(B) > \text{NSW}(A)$$

$$\Leftrightarrow (v_i(A_i) + v_i(g^*)) (v_j(A_j) - v_j(g^*)) > v_i(A_i) v_j(A_j)$$

$$\Leftrightarrow v_i(g^*) v_j(A_j) - v_j(g^*) [v_i(A_i) + v_i(g^*)] > 0$$

$$\Leftrightarrow v_j(A_j) > \frac{v_j(g^*)}{v_i(g^*)} [v_i(A_i) + v_i(g^*)] \quad \text{--- (1)}$$

since $v_i(g^*) > 0$.

Now, by the choice of g^*

$$\frac{v_j(g^*)}{v_i(g^*)} \leq \frac{v_j(g)}{v_i(g)} \quad \forall g \in A_j$$

$$\Rightarrow \frac{v_j(g^*)}{v_i(g^*)} \leq \frac{\sum_{g \in A_j} v_j(g)}{\sum_{g \in A_i} v_i(g)} = \frac{v_j(A_j)}{v_i(A_j)} \quad \text{--- (2)}$$

and by EFI violation

$$v_i(A_i) < v_i(A_j) - v_i(g^*) \quad \dots \quad (3)$$

$$\Rightarrow v_i(A_j) > v_i(A_i) + v_i(g^*)$$

$$\begin{aligned} \text{From (2): } v_j(A_j) &\geq v_i(A_j) \cdot \frac{v_j(g^*)}{v_i(g^*)} \\ &> \frac{v_j(g^*)}{v_i(g^*)} (v_i(A_i) + v_i(g^*)) \end{aligned}$$

[from (3)]
□

hence (1) is proved

Existence of EFI + PO is guaranteed. But computation is not easy.

Thm (Lee, 2017): Maximizing Nash social welfare is APX-hard.

[holds for bounded valuations as well]

Thm (Barman, Krishnamurthy, Vaish, 2018)

An EFI + PO allocation can be computed in pseudopolynomial time.

- Running time depends on v_{ij} rather than $\log v_{ij}$.
- Poly for bounded valuations.
- 0.69 - approximation to NSW objective.

Fair allocation of Bads/Chores

In more general terms, the definition of goods/chores are in terms of marginal values.

- $v_i(S)$ = value of agent i for the bundle $S \subseteq M$

An item A is a good ~~if~~ for i if $v_i(SUA) - v_i(S) \geq 0$ any useful resource
cloud, ~~at~~ spectrum

An item B is a bad for i if $v_i(SUA) - v_i(S) \leq 0$ any corrosive item
a factory, household

chores, jobs in an organisation,
a programming assignment,

Another setup is ~~to~~ where items are mixed - goods for some and bads for others.

A specific problem set may ~~be~~ have problems that are goods for some and bads for others.

Equivalent definition: goods: that have monotone non-decreasing valuations for each agent

$$v_i(S) \geq v_i(T) \text{ if } S \supseteq T$$

bads: that have monotone non-increasing valuations for each agent.

$$v_i(S) \leq v_i(T) \text{ if } S \supseteq T$$

These definitions are equivalent to the marginal value definition [show this]

Envy-freeness was impossible for indivisible objects.
Also difficult to ascertain if an instance has EF solution.

Envy-free upto one good was feasible for any monotone valuation.

- Round Robin for additive
- Envy-cycle elimination for monotone valuation

In the "bads" world

EF upto one chore: (still written EFI)

An allocation $A = (A_1, A_2, \dots, A_n)$ is EFI if for each pair of agents i, j , $\exists x_i$ s.t.

$$v_i(A_i \setminus \{x_i\}) \geq v_i(A_j)$$

Q: What algorithms satisfy EFI for the chores?

Case 1: Additive chores. Does RR work?

Thm: For additive chores, RR algorithm ensures EFI.

Proof: Consider an arbitrary pair of agents i and j

