

EFX: n agents N , m goods M , v_{ij} is agent i 's value for good j .

An allocation A is EFX if $\forall i, j \in N$

$$v_i(A_i) < v_i(A_j) \Rightarrow \forall g \in A_j, v_i(A_i) \geq v_i(A_j \setminus g)$$

Say agent i strongly envies agent j if this is violated

Thus A is an EFX allocation $\Leftrightarrow$ there is no strong envy.

Open Q: For additive goods, does $\exists$ an EFX allocation?
(settled recently for additive chores, & subadditive goods, negatively)

① Identical monotone:

Assume that $\forall i, j \in N$, & $\forall S, T \subseteq M$, $v_i(S) = v_j(T) \Rightarrow i = j$ & $S = T$

For allocation A , define $\vec{v}(A) = (v_i(A_i))_{i \in N}$, sorted in increasing order.

Say $\vec{v}(A) > \vec{v}(A')$ if for some $i \in [n]$,

$$(\vec{v}(A))_i > (\vec{v}(A'))_i$$

& $\forall j < i$, $(\vec{v}(A))_j = (\vec{v}(A'))_j$

thus, $\vec{v}(A) > \vec{v}(A')$ if either least value in $v(A) >$ least value in $v(A')$
or these are equal &
2nd least value in $v(A) >$ 2nd least value in $v(A')$
& both of these are equal &
...

Note that for any 2 allocations A, A' ,
either $\vec{v}(A) > \vec{v}(A')$ or $\vec{v}(A') > \vec{v}(A)$ (or $A = A'$)
i.e., this imposes a total order on the set of allocations.

This is called a **lexicographic ordering**.

Let A^* be the allocation s.t. $\vec{v}(A^*) > \vec{v}(A) \quad \forall A \neq A^*$.

A^* is called the **leximin** (or lexicographically minimum) allocation.

Theorem: For identical monotone valuations, the leximin allocation is EFX.

Proof: Let A^* be the leximin allocation, & for a contradiction assume

A^* not EFX. Then exists $i \neq j$ s.t.

$$v(A_i^*) < v(A_j^*) < \dots < v(A_n^*)$$

Then $\exists i < j$ s.t. $\forall g \in A_j$, $v(A_i) < v(A_j \setminus g)$

Now consider the allocation A' where $A'_i = A_i \setminus g$

$$A'_j = A_j \cup g$$

Note that $v(A'_i) > v(A_i)$ & $v(A'_j) > v(A_j)$

Then $\forall k \leq i-1$, $v(A'_k) = v(A_k)$

$$\forall k \geq i \quad v(A'_k) > v(A_k)$$

Thus $\vec{v}(A') > \vec{v}(A^*)$, & A^* cannot be the leximin allocation. $\square$

Theorem: Even for 2 agents with identical monotone non-decreasing

submodular valuations:

① Finding an EFX allocation has exponential query complexity, and

② is PLS-complete.

Theorem: For 2 agents with (nonidentical) monotone non-decreasing

valuations, $\exists$ an EFX allocation

Proof: Cut & choose.

Assume 2 identical agents, both with valuation v_i .

Let $A = (A_1, A_2)$ be an EFX allocation. (agent 1 cuts)

Note that no matter which of these two bundles agent 1 gets,

she does not strongly envy agent 2.

Agent 2 chooses her preferred bundle, agent 1 gets the

remaining bundle $\square$

Theorem: For 3 types of agents w/ additive monotone valuations, $\exists$ an

EFX allocation.

Agents are of the same type if they have the same valuation.

For 4 agents w/ additive valuations, the problem is open.

Identical ordering: An instance I is identically ordered if

$$\exists \pi: [m] \rightarrow [m] \text{ s.t. } \forall \text{ agents } i,$$

$$v_i(\pi(1)) \geq v_i(\pi(2)) \geq \dots \geq v_i(\pi(m))$$

Consider the envy cycle elimination algorithm where items are allocated

in this order.

Theorem: The algorithm returns an EFX allocation.

(prove yourself)

Claim: Let A be an EFX (partial) allocation, G be the envy graph.

Let C be a directed cycle in the envy graph, & A' be obtained

by resolving C . Then A' is EFX

Proof: Note that the multiset of bundles has not changed.

For any agent i outside C , the multiset of bundles and her own

bundle has not changed.

Let $\{b_1, \dots, b_n\}$ be the multiset of bundles.

Then if $v_i(A_i) < v_i(b_k)$, then $\forall g \in b_k$, $v_i(A_i) \geq v_i(b_k \setminus g)$

& $v_i(A'_i) = v_i(A_i)$ & this still holds.

Similarly for an agent in the cycle, the multiset of bundles has not

changed, & her own value has strictly improved. $\square$

2 types of relaxations:

① An allocation is α -EFX if $\forall i, j$,

$$v_i(A_i) < v_i(A_j) \Rightarrow \forall g \in A_j, v_i(A_i) \geq \alpha \cdot v_i(A_j \setminus g)$$

② Envy with charity:

Let $A = (A_1, \dots, A_n)$ be a partial allocation, & $C = G \setminus \bigcup A_i$.

Then A is an EFX allocation with charity if:

- A is EFX,
- no agent envies C .

Approximate EFX

A valuation fn. $v: 2^M \rightarrow \mathbb{R}_+$ is subadditive if $\forall S, T \subseteq M$,

$$v(S) + v(T) \geq v(S \cup T)$$

Theorem: For agents w/ subadditive valuations $\exists$ a $1/2$ -EFX allocation.

Algorithm:

Let $A_i = \emptyset \quad \forall i \in N$, $R = M$

While $R \neq \emptyset$

Resolve any envy cycles

If $\exists i \in N$, $g \in R$ s.t. $v_i(g) > v_i(A_i)$

$$R \leftarrow R \cup A_i, \quad A_i \leftarrow g \quad (\text{swap } A_i \text{ w/ } g)$$

Else

give an arbitrary good from R to a source in the graph.

Proof: By induction.

Initially, A is $1/2$ -EFX

Resolving envy cycles maintains $1/2$ -EFX.

In the swap operation, where agent i swaps:

- no agent strongly envies agent i

- agent i 's value strictly improves, & the multiset of bundles

she sees is unchanged.

If a good g is allocated to a source i :

- i 's value goes up, & the multiset of bundles she sees is

unchanged

- Let A be allocation before allocating good g . Then $\forall j \neq i$

$$v_j(A_i \cup g) \leq v_j(A_i) + v_j(g) \leq v_j(A_j) + v_j(g) = v_j(A_j)$$

Since i was a source, since j did not swap her bundle for g $\square$

EFX with charity

Theorem: For any instance w/ monotone valuations, there exists a

partial allocation $A = (A_1, \dots, A_n)$ w/ charity $C = M \setminus \bigcup A_i$

s.t.

① A is EFX

② $\forall i \in N$, $v_i(A_i) \geq v_i(C)$

③ $|C| \leq n-1$

Defn: Let A be a partial allocation, B be a bundle of goods

$B \subseteq M$.

Agent i is a **not** envious agent of B if:

1. $\exists S \subseteq B$ s.t. $v_i(A_i) < v_i(S)$, and

2. $\forall S' \subseteq S$, no agent envies S' (including i)

$$\text{i.e. } \forall j \in N, v_j(A_j) \geq v_j(S')$$

The set S is called the **minimal envied subset**.

Now if we just want ① & ③, this is easy

Algo:

$\forall i$ $A_i = \emptyset$, $C = M$

While any agent envies C :

Let i be a most envious agent of C , S be a minimal

envied subset of C .

$$C \leftarrow C \cup A_i, \quad A_i \leftarrow S$$

Claim: The algo returns an EFX partial allocation where no agent

envies C .

Proof: The algorithm clearly terminates, since in every iteration, some

agent's value strictly increases.

If A is EFX before an iteration, then it is EFX after:

its value strictly increases while other bundles are unchanged,

& no agent strictly envies i .

Give a partial allocation A , agent i , let $P(i)$ be the set of agents that

i has a directed path to in the envy graph.

Algo for ① ③ & ⑤:

Rule 0: Resolve any envy cycles

If rule 0 not applicable:

Rule 1: If $\exists g \in C$ & $i \in N$ s.t. allocating g to i results in an

EFX allocation:

- give g to i

(note that i 's must be a source in the envy graph, & minimal envied set of A_i vs i is A_i vs i .)

If rules 0 & 1 not applicable:

Rule 2: If $\exists i \in N$ s.t. $v_i(C) > v_i(A_i)$:

- Let i be a most envious agent of C , $S \subseteq C$ be a

minimal envied subset.

- Exchange A_i & S

If rules 0, 1, & 2 are not applicable:

Rule 3: Find a set of k goods $g_1, \dots, g_k \in C$ & k sources $s_1, \dots, s_k$,
& k distinct agents $t_1, \dots, t_k$ so that:

$\forall i \in [k]$, t_i is a most envious agent of $A_{s_i} \cup g_i$,

$$t_i \notin \bigcup_{j \neq i} P(s_j), \quad \& \quad t_i \in P(s_i)$$

- Let $Z_i \subseteq A_{s_i} \cup g_i$ be the minimal envied subset of $A_{s_i} \cup g_i$

- Let P_i be the path from s_i to t_i .

Claim: The paths $P_1, \dots, P_k$ are all distinct.

Proof: Say $v \in P_i \cap P_j$, & $i < j$

P_i is a path from s_i to t_i , P_j is $s_j \rightarrow t_{j-1}$.

But then $t_{j-1} \in P(s_i)$ for $j > i$, which is not allowed. $\square$

- Construct allocation A' as follows:

$\forall i \in [k]$:

$$A'_{t_i} \leftarrow Z_i, \quad C \leftarrow C \cup A_{t_i}$$

every agent in P_i except t_{i-1} gets the successive agents' bundle.

Claim: If A is EFX, then after application of rule 3, the resulting

allocation is EFX.

Proof: Firstly, for every agent in $\bigcup P_i$, the value strictly

improves. Other agents are unchanged.

Secondly, the multiset of bundles is unchanged, except

every bundle A_{t_i} is replaced by Z_i . But Z_i is a

minimal envied subset, so no agent envies any strict subset

of Z_i . Hence EFX.

Claim: If 1c1 $\geq$ not & rules 0, 1, 2 do not hold, then rule 3

must hold.

(prove yourself)