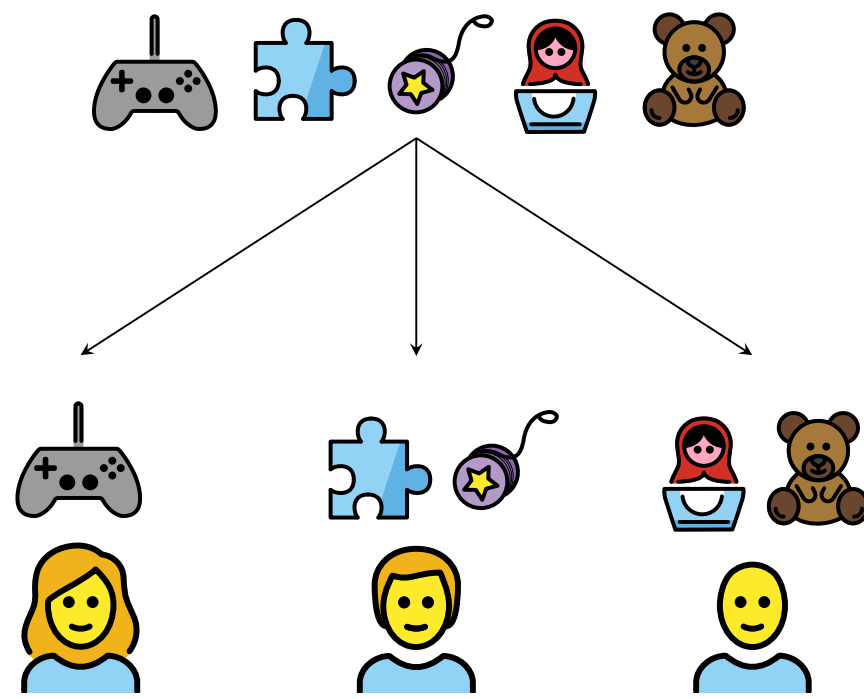


The Fair Division Problem

Distribute (indivisible) goods among agents *fairly*.



Input: n agents and a set M of m goods.
 $v_i(g)$ is agent i 's value for good g .
For any $S \subseteq M$, let $v_i(S) := \sum_{g \in S} v_i(g)$.

		m				
		game controller	puzzle	teddy bear	star	teddy bear
n	Agent 1	10	4	8	9	3
	Agent 2	5	3	3	8	2
	Agent 3	5	2	0	2	2

Output: an allocation $A = (A_1, \dots, A_n)$, where A_i is agent i 's bundle of goods.

$$A = (\{\text{teddy bear, star}\}, \{\text{game controller, puzzle}\}, \{\text{game controller, puzzle}\})$$

Defining Fairness

Envy-freeness (EF): Agent i is envy-free in allocation A if for every $j \neq i$, we have $v_i(A_i) \geq v_i(A_j)$.

Proportionality (PROP): Allocation A is PROP-fair to agent i if $v_i(A_i) \geq v_i(M)/n$.
 $v_i(M)/n$ is called i 's PROP-share.

V	game controller	teddy bear	star	$\frac{v_i(M)}{n}$
Agent 1	4	2	6	6
Agent 2	5	15	25	22.5

Figure 1. An allocation that is both EF and PROP.

Theorem: If agent i is EF in allocation A , then A is PROP-fair to i .

EF or PROP allocations may not exist!
E.g., if $m = 1$.

Approximate Fairness

Even though we can't be exactly fair, we can be approximately fair.

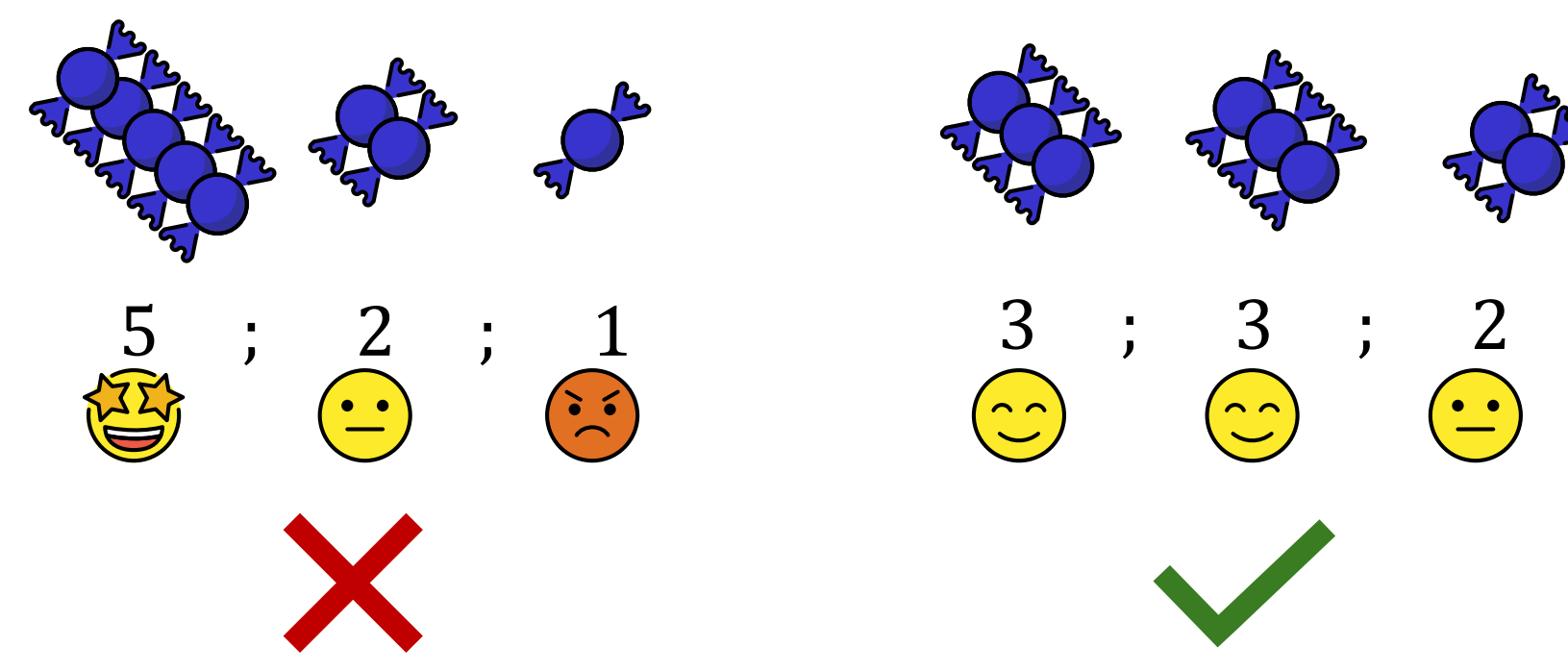


Figure 2. For $n = 3$ and $m = 8$, $(3, 3, 2)$ is fairer than $(5, 2, 1)$.

When goods are identical, each agent should get $\lfloor m/n \rfloor$ or $\lceil m/n \rceil$ goods. Equivalently, any two bundles should differ by at most 1 good. How do we generalize this?

Notions of (approximate) fairness of allocation A to agent i :

EFX: $\forall j \neq i, \forall g \in A_j, v_i(A_i) \geq v_i(A_j \setminus \{g\})$.

EF1: $\forall j \neq i$, either $A_j = \emptyset$ or $v_i(A_i) \geq v_i(A_j \setminus \{g\})$ for some $g \in A_j$.

MMS: $v_i(A_i) \geq \mu_i := \max_{(X_1, \dots, X_n)} \min_{j=1}^n v_i(X_j)$.

EEFX: \exists allocation B such that $B_i = A_i$ and B is EFX-fair to i .

For $n = 2$, EF = PROP and EFX = EEFX.

Allocation	EF1	EFX	MMS	EEFX
$(\{\text{house, bicycle}\}, \{\text{car}\})$	✓	✗	✗	✗
$(\{\text{house}\}, \{\text{car, bicycle}\})$	✓	✓	✓	✓

Figure 3. Example with $n = 2$ and $m = 3$.

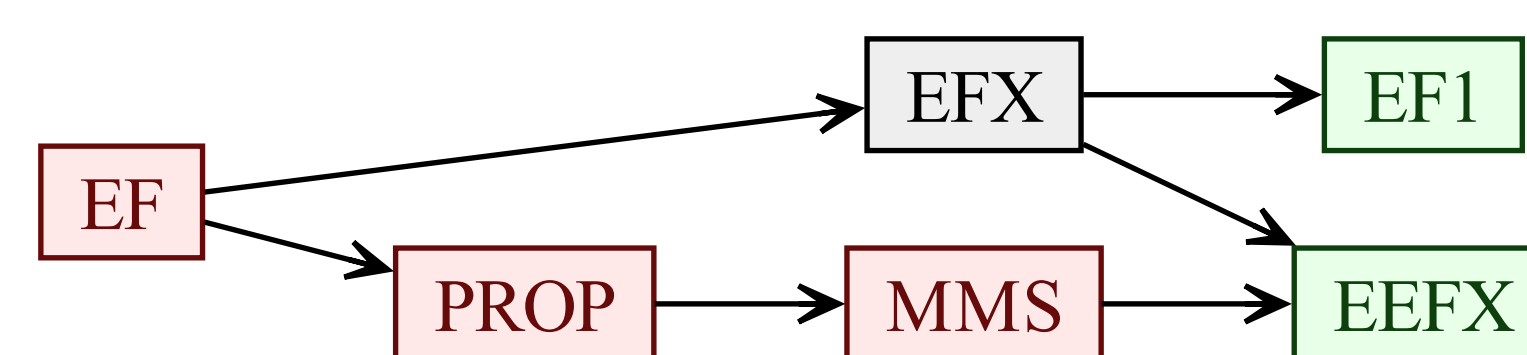


Figure 4. $\overline{F_1} \rightarrow \overline{F_2}$ iff every F_1 -fair allocation is also F_2 -fair.

Key Problems

Feasibility: Does a fair allocation exist for every input?

Computability: Can we find a fair allocation in polynomial time if it exists?

Known Results

notion	feasible	computable	
EFX	<i>open</i>	<i>open</i>	
EF1	yes	polytime	[9]
EEFX	yes	polytime	[4]★
MMS	no	NP-hard	[5]
3/4-MMS	yes	polytime	[8]

For $n = 2$, EFX is feasible and polytime computable.

Introducing Randomness

Using randomization, we can get EF and PROP *ex ante* (i.e., in expectation).

E.g., for 3 agents and 7 identical goods, we output one of $(3, 2, 2)$, $(2, 3, 2)$, and $(2, 2, 3)$ with probability $1/3$ each.

Notions of randomized fairness of allocation A to agent i :

ex ante EF: $\forall j \neq i, \mathbb{E}(v_i(A_i)) \geq \mathbb{E}(v_i(A_j))$.

ex ante PROP: $\mathbb{E}(v_i(A_i)) \geq v_i(M)/n$.

	ex post	ex ante
[2]	EF1	EF
[3]	1/2-MMS	PROP
[6]	EF1 + 1/2-EFX	1/2-EF
★[1]	3/4-MMS	0.8253-MMS

For $n = 2$, EFX + ex ante EF was known [6], but not in polytime. We give an $O(m \log m)$ -time algorithm [7]★.

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