

# On the polynomial computation of EFX allocations for 3 agents and 3-valued instances



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# Introduction

This thesis is about the Fair Division Problem. Such problem arises in several everyday task:

- Divide Goods
- Distribute Tasks
- Frequency Allocation
- ...

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# Outline

## 1 Definitions

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## Preliminaries

- Set  $N$  of  $n$  agents
- Set  $M$  of  $m$  indivisible goods
- $v_i(\cdot)$  is the valuation function of player  $i$
- $\mathcal{A} = (A_1, \dots, A_n)$  is a partition of the goods,  $A_i$  is the set associated to player  $i$ .
- The task is producing an allocation that respects a fairness notion for each player.

## Envy Free

- An allocation  $\mathcal{A} = (A_1, A_2, \dots, A_n)$  is envy-free (EF) if

$$\forall i, j \in N, v_i(A_i) \geq v_i(A_j)$$

- There is **not** always a possible EF allocation for indivisible items.  
Example: one item and two players that value such item more than zero.
- Because of the impossibility of computing EF allocation in some cases, have been introduced two relaxations of this criterion: *envy free up to one item* and *envy free up to any item*.

## Envy Free Up to One Item

- An allocation  $\mathcal{A} = (A_1, A_2, \dots, A_n)$  is envy-free up to one good (EF1) if

$$\forall i, j \in N, A_j \neq \emptyset, \exists g \in A_j : v_i(A_i) \geq v_i(A_j \setminus \{g\})$$

- Exists an algorithm that is capable of computing EF1 allocation in polynomial time in the case of monotone valuation functions.

## Envy Free Up to Any Item

- An allocation  $\mathcal{A} = (A_1, A_2, \dots, A_n)$  is envy-free up to any good (EFX) if

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

- This is a much stronger version of the EF1 criteria: in the case of additive function
  - EF1: remove from  $A_j$  item  $\operatorname{argmax}_{x \in A_j} v_i(x)$
  - EFX: remove from  $A_j$  item  $\operatorname{argmin}_{x \in A_j} v_i(x)$



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## Envy Free Up to Any Item Recent Studies

In the last years this criteria has been extensively studied:

- in 2016 has been given a formal definition [Car+19],
- in 2018 has been shown that with the divide and choose algorithm we can obtain EFX for two players or  $n$  players with identical valuation functions[PR20].
- in 2019 has been shown that we can build allocations that are EFX and have at least half of the maximum possible Nash Welfare by assigning to the agents only a subset of the items and giving the remaining ones to charity[CGH19].
- in 2020 has been shown that for 3 players always exists an EFX allocation[CGM20].

## Envy Free Up to Any Item Results

So summarizing till now we have the following results with respect to the number of agents:

- 2 players: the divide and choose algorithm produces an EFX allocation in polynomial time[PR20].
- 3 players: always exists an EFX allocation, but till now we only have a pseudo-polynomial algorithm[CGM20].
- $\geq 4$  players: there exists an EFX allocation if we consider only a subset of the entire set of items[CGH19].

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# Match&Freeze Algorithm

The work proposed in this thesis is based on the Match&Freeze Algorithm[Ama+21]

- Produces EFX allocation for  $n$  players with additive valuation functions that value each item with one out of two possible values.
- Is based on two concepts: assign items at each iteration with the maximum matching algorithm and if one player envies another freeze the envied player.

# Our Work

In this thesis we have done the two following things:

- We have build a modified version of the Match&Freeze algorithm that works with additive valuation functions with three values and two players.
- We have exploited the freezing technique to show how to obtain EFX allocation for three players and additive valuation functions with three values with some constraint over the values.

## Counterexample of the Match&Freeze Algorithm for Three Values

Example showing that the Match&Freeze algorithm does not work when there are three values valuation functions

	$i_1$	$i_2$	$i_3$	$i_4$	$i_5$
$p_1$	100	50	50	50	50
$p_2$	50	1	1	1	1

## Counterexample of the Match&Freeze Algorithm for Three Values

By following the Match&Freeze algorithm we obtain the allocation shown in bold in table 1. This is not an EFX allocation since

$$v_1(A_1) = 100 < v_1(A_2 \setminus \{i_2\}) = 150$$

	$i_1$	$i_2$	$i_3$	$i_4$	$i_5$
$p_1$	<b>100</b>	50	50	50	50
$p_2$	50	<b>1</b>	<b>1</b>	<b>1</b>	<b>1</b>

Table: Counter example for the Match&Freeze algorithm



## Match&Freeze++ Algorithm for Three Values

The main idea is:

- We execute the original algorithm till the end
- If we do not obtain an EFX allocation we rollback to the iteration in which we freeze a player and change the assignment ignoring maximum matching.

	$i_1$	$i_2$	$i_3$	$i_4$	$i_5$
$p_1$	100	<b>50</b>	<b>50</b>	50	<b>50</b>
$p_2$	<b>50</b>	1	1	<b>1</b>	1

Table: Match&Freeze++ algorithm

## Modification for Two Players

- Introduce the concept of **problematic assignment** as an assignment after which the original algorithm could not produce an EFX allocation.
- If we do not obtain an EFX allocation we rollback to the problematic assignment, invert the assignment and resume the algorithm.
- Redefine the number of iterations for which a player is frozen and the items that a non frozen player takes while the other is frozen.

# Three Players and Three Values Problems

1. We introduce a constraint over the three values
2. In the case of three players we cannot use maximum matching to assign the items while a player is frozen.

## Three Players and Three Values Constraint on the Values

Considering that the three values are  $a > b > c$  we have the following constraint

$$c \geq a \mod b$$

Without such constraint we could have that the two non frozen player start to envy each other because of how we assign the items while a player is frozen.

## Three Players Three Values Maximum Matching

The allocation shown in the following table is not EFX since  $p_1$  envies  $p_3$ :  $A_1 = \{i_1, i_{14}\}$ ,  $A_3 = \{i_3, i_4, i_6, i_8, i_{10}, i_{12}\}$  and we have that  $v_1(A_1) = 440$   $v_1(A_3 \setminus \{i_{12}\}) = 500$

	$i_1$	$i_2$	$i_3$	$i_4$	$i_5$	$i_6$	$i_7$	$i_8$	$i_9$	$i_{10}$	$i_{11}$	$i_{12}$	$i_{13}$	$i_{14}$
$p_1$	<b>400</b>	100	100	100	40	100	40	100	40	100	40	40	40	<b>40</b>
$p_2$	400	<b>100</b>	100	100	<b>100</b>	100	<b>100</b>	40	<b>40</b>	40	<b>40</b>	40	<b>40</b>	40
$p_3$	100	100	<b>100</b>	<b>100</b>	100	<b>100</b>	100	<b>100</b>	40	<b>100</b>	40	<b>40</b>	40	40

## Three Players Three Values Maximum Matching

- If we freeze  $p_2$  rather than  $p_1$  we could obtain the a similar allocation that is not EFX since as we can notice if we invert  $p_1$  and  $p_2$  we have the same number of items for each remaining type.
- A type is a class of items represented by a triple with the value for each player for such class of items in order.
- So I had to define the order of the items to assign to the non frozen players while a player was frozen.

## Approach used for the Three Player Case

I have divided the problematic assignments in two types:

- two players envy the frozen player: in such a case I have solved the different problematic assignments one by one, by defining which items give to which players.
- only one player envies the frozen player: in such a case I have defined a unique algorithm.
  - The player that does not envy the others chooses the type of item.
  - The other non frozen player takes an item of the same type.
  - The frozen player will envy or both or none of the two non frozen players.

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