

# Lecture 3: Assignment markets

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# Introduction

Two-sided matching models consider situations where individuals (or agents) have to be matched to other individuals (or agents).

The insights and tools of two-sided matching models can also be used to study **assignment problems**:

- ▶ There is a set of **individuals**:  $I = \{i_1, i_2, \dots, i_n\}$ .
- ▶ There is a set of **objects**:  $K = \{k_1, k_2, \dots, k_m\}$ .

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# Assignments

A **one-to-one assignment** is defined like a matching: it specifies, who is assigned to what.

## Definition

An **assignment** is a function  $\mu : I \cup K \rightarrow I \cup K$  such that:

- ▶ for each individual  $i \in I$ ,  $\mu(i) \in K \cup \{\emptyset\}$ ;
- ▶ for each object  $k \in K$ ,  $\mu(k) \in I \cup \{\emptyset\}$ ;
- ▶  $\mu(i) = k$  if, and only if  $\mu(k) = i$ .

# Endowments

There are two broad families of assignment problems, depending on who owns, at the outset, the objects.

- ▶ **None of the objects belong to anyone**

This case is called the **public endowment** problem. All the objects belong to the whole society.

**Example:** Assignment of public housing.

- ▶ **The individuals own the objects**

This case is called the **private endowment** problem.

**Example:** barter, with individuals trading goods without monetary transactions.

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**Example:** barter, with individuals trading goods without monetary transactions.



Some problem study a mix private-public endowments: some objects, but not all, are initially owned by some individuals.

**Example:** Dorms on (some) campus:

- ▶ public endowment: rooms left by recent graduates.
- ▶ private endowment: rooms occupied by sophomores, juniors and seniors.

# Evaluating assignments

Defining an objective or a property about assignments can depend on how objects are defined:

- ▶ Each object has a **priority ordering** over agents.

Such orderings specify which individual should be “considered” first when allocating the objects.

Priority orderings work a *little bit* like preferences. But they are **not** preferences ( $\Rightarrow$  they do not enter welfare analysis).

- ▶ The objects are “free”: no specification about who has a higher priority or right over the objects.

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# Efficiency

One of the main properties considered when analyzing assignment is efficiency.

## Definition

An assignment  $\mu$  is **efficient** if there is no other assignment  $\mu'$  such that:

- ▶ each individual either prefer  $\mu'$  to  $\mu$  or is indifferent between the two assignments (they obtain the same object).
- ▶ There is at least one individual who strictly prefers  $\mu'$  to  $\mu$ .

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## Example

- ▶ Three individuals: Alice, Bob and Carol.
- ▶ Three objects:  $A$ ,  $B$  and  $C$ .

$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
$A$	$C$	$B$
$C$	$A$	$C$
$B$	$B$	$A$

The assignment

$$\mu(\text{Alice}) = C, \mu(\text{Bob}) = A \text{ and } \mu(\text{Carol}) = B$$

is **not efficient**, because the (efficient) assignment

$$\mu(\text{Alice}) = A, \mu(\text{Bob}) = C \text{ and } \mu(\text{Carol}) = B$$

is better for both Alice and Bob (while making Carol indifferent).

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# Finding efficient assignments

The simplest (and often used) solution is the **serial dictatorship**.

## Step 0:

pick an order of the individuals (not necessarily random).

## Step 1:

The first individual in the order is assigned her most preferred object.

## Step $k$ , $k \geq 2$ :

The individual ranked  $k$ -th in the order is assigned her most preferred object among all objects except the ones taken by the first  $k - 1$  individuals in the order.

**End:** The algorithm stops when all individuals have chosen an object or when there is no object left.

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- ▶ *the assignment obtained with the serial dictatorship is **efficient**.*
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## Intuition:

- ▶ Take the  $k - th$  individual. She took the most preferred object among the remaining ones.

The only way to make her better off is assigning her an object taken by the 1st, 2nd,  $\dots$ , or the  $(k - 1)$ -th individual.

- ▶ When it's your turn you obtain your best possible object. Nothing to lose by being truthful.

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# Trading with endowments

With private endowments we can use serial dictatorship but it creates a problem:

Someone may end up with an object **less preferred** than her endowment.

A way out is to allow individuals to **trade** their endowments. The most celebrated solution for that is the **Top Trading Cycle algorithm** (TTC).

The general principle of TTC is to draw a graph where individuals “points” to the object they want.

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# Top Trading Cycle algorithm

## Step 1

Each individual **points** (we draw an arrow) to the individual owning the object she prefers the most (could be herself).

There is **always** at least one **cycle**: when starting from an agent and following the arrows we eventually reach the agent again.

For each agent in a cycle assign her the object owned by the individual she is pointing to.

Remove from the problem all the agents (and their objects) who were part of a cycle.

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## Step $k, k \geq 2$

Do like in Step 1, with individuals pointing to their most preferred object among the objects that have not been removed at an earlier step.

## End:

The algorithm stops when all individuals have been removed or there are no acceptable objects left for any individual that has not been removed yet.

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# Example

Endowment  $\rightarrow$

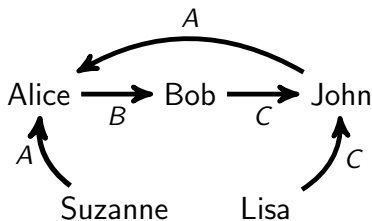
$A$	$B$	$C$	$D$	$E$
$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{John}}$	$P_{\text{Lisa}}$	$P_{\text{Suzanne}}$
$B$	$C$	$A$	$C$	$A$
$E$	$A$	$E$	$A$	$C$
$D$	$D$	$D$	$E$	$B$
$C$	$E$	$B$	$B$	$D$
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Endowment  $\rightarrow$

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$E$	$A$	$E$	$A$	$C$
$D$	$D$	$D$	$E$	$B$
$C$	$E$	$B$	$B$	$D$
$A$	$B$	$C$	$D$	$E$

## Step 1



We have a cycle:

John gets  $A$

Alice gets  $B$

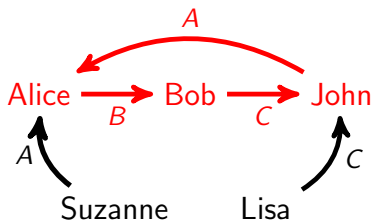
Bob gets  $C$

# Example

Endowment  $\rightarrow$

	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{John}}$	$P_{\text{Lisa}}$	$P_{\text{Suzanne}}$
	<i>B</i>	<i>C</i>	<i>A</i>	<i>C</i>	<i>A</i>
	<i>E</i>	<i>A</i>	<i>E</i>	<i>A</i>	<i>C</i>
	<i>D</i>	<i>D</i>	<i>D</i>	<i>E</i>	<i>B</i>
	<i>C</i>	<i>E</i>	<i>B</i>	<i>B</i>	<i>D</i>
	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>

## Step 1



We have a cycle:

John gets *A*

Alice gets *B*

Bob gets *C*

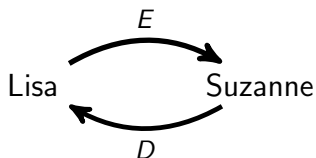


## Example

Endowment  $\rightarrow$

$A$	$B$	$C$	$D$	$E$
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### Step 2



We have a cycle:

Lisa gets  $E$

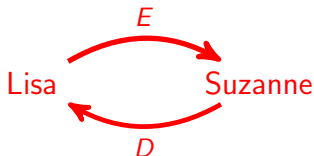
Suzanne gets  $D$

# Example

Endowment  $\rightarrow$

	$A$	$B$	$C$	$D$	$E$
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	$C$	$E$	$B$	$B$	$D$
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## Step 2



We have a cycle:

Lisa gets  $E$

Suzanne gets  $D$

# Example

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{John}}$	$P_{\text{Lisa}}$	$P_{\text{Suzanne}}$
	<i>B</i>	<i>C</i>	<i>A</i>	<i>C</i>	<i>A</i>
	<i>E</i>	<i>A</i>	<i>E</i>	<i>A</i>	<i>C</i>
	<i>D</i>	<i>D</i>	<i>D</i>	<i>E</i>	<i>B</i>
	<i>C</i>	<i>E</i>	<i>B</i>	<i>B</i>	<i>D</i>
	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>

Final allocation:

$$\begin{aligned}\mu(\text{Alice}) &= B & \mu(\text{Bob}) &= C & \mu(\text{John}) &= A \\ \mu(\text{Lisa}) &= E & \mu(\text{Suzanne}) &= D\end{aligned}$$

## Proposition

*For any problem:*

- ▶ *the assignment obtained with the Top Trading Cycle algorithm is **efficient**.*
- ▶ *a preference revelation mechanism using the Top Trading Cycle algorithm is **strategyproof**.*

The intuition for the efficiency of TTC is similar to the argument used for serial dictatorship.

- ▶ Individuals assigned in the first cycles obtain their top choices: for them, it's efficient.
- ▶ For the individuals in the second cycle, either:
  - ▶ they have their top choice;
  - ▶ their top choice is gone: assigned to someone in the first cycle. The only way to make them better off is to make a first cycle individual worse off.

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In fact, both the serial dictatorship and TTC have stronger incentive properties: they are both **group strategyproof**.

But TTC is, in some sense, the “right” algorithm.

Recall that an assignment is **individually rational** if nobody gets an object less preferred than the endowment.

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TTC can also be used when endowments are public and objects have priority orderings over individuals.

The algorithm needs a few tweaks. At any step,

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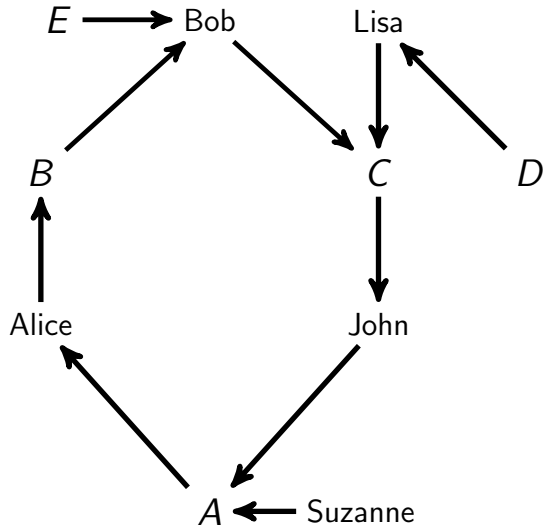
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# Example

$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{John}}$	$P_{\text{Lisa}}$	$P_{\text{Suzanne}}$
$B$	$C$	$A$	$C$	$A$
$E$	$A$	$E$	$A$	$C$
$D$	$D$	$D$	$E$	$B$
$C$	$E$	$B$	$B$	$D$
$A$	$B$	$C$	$D$	$E$

$P_A$	$P_B$	$P_C$	$P_D$	$P_E$
Alice	Bob	John	Lisa	Bob
John	Lisa	Suzanne	Suzanne	Lisa
Bob	Suzanne	John	Alice	Alice
Suzanne	Alice	Lisa	John	John
Lisa	John	Alice	Bob	Suzanne

Step 1



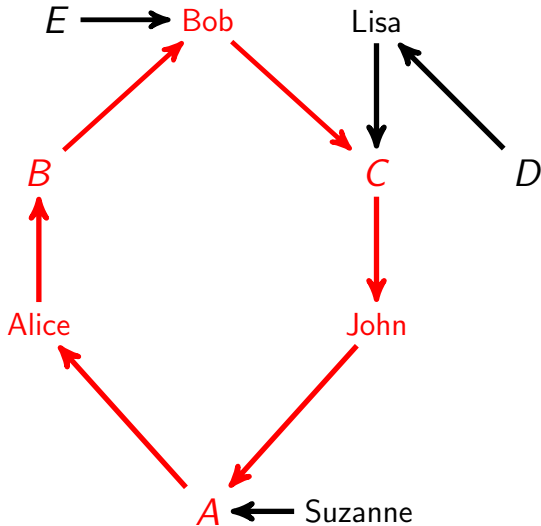
We have a cycle:

Bob gets  $C$

John gets  $A$

Alice gets  $B$

Step 1



We have a cycle:

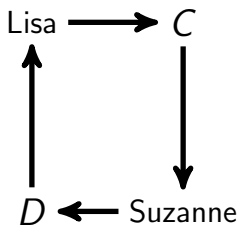
Bob gets C

John gets A

Alice gets B



## Step 2

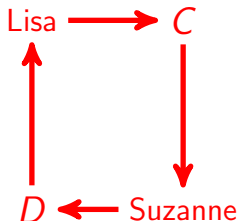


We have a cycle:

Suzanne gets  $D$

Lisa gets  $C$

## Step 2



We have a cycle:

Suzanne gets  $D$

Lisa gets  $C$

# Individual rationality and the core

Individual rationality is the requirement that nobody gets an assignment less preferred than the endowment.

We can extend this notion to **groups** of individuals.

## Definition

The **core** of an assignment problem is the set of all assignments  $\mu$  such that there is no coalition  $S$  of individuals and an assignment  $\mu'$  for which:

1. For each individual in  $i \in S$ , the object  $\mu'(i)$  is the endowment of another individual in  $S$ ;
2. Each individual in  $S$  prefers  $\mu'$  to  $\mu$  or is indifferent between  $\mu$  and  $\mu'$  and there is **at least one individual** who strictly prefers  $\mu'$  to  $\mu$ .

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Efficiency  $\neq$  core

Endowment $\rightarrow$	$A$	$B$	$C$
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
	$B$	$A$	$A$
	$C$	$B$	$B$
	$A$	$C$	$C$

The assignment

$$\mu(\text{Alice}) = C, \quad \mu(\text{Bob}) = B, \quad \mu(\text{Carol}) = A$$

is efficient. But it's not in the core:

But Alice & Bob can be better off without Carol. They can trade their endowments (Alice gets  $B$  and Bob gets  $A$ ), a better option than  $\mu$ .

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Once again, TTC proves to be a really good algorithm:

### Theorem (Roth and Postlewaite)

*For any assignment problem:*

- ▶ *there is always a unique assignment that is in the core;*
- ▶ *the core assignment can be obtained with the Top Trading Cycles algorithm.*

# Mixed public-private endowments

The case of dorms on campus is a classic example of assignment with public **and** private endowments:

- ▶ **Private endowments:** the students who were already on campus the previous academic year.

The room they occupied the previous year is their private endowment;

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We review various mechanisms used on US campuses and use the following model:

- ▶ There is a set of individuals and a set of **houses** (the objects).
- ▶ Individuals are split into two groups:
  - ▶ **Existing tenant**: an individual who already “owns” a house (a student who was on campus the previous year and hasn’t graduated yet).

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# Carnegie-Mellon, Duke, Harvard

The mechanism used by (among others) these universities is known as the **Random serial dictatorship with squatting rights**.

**Step 1:** Existing tenants announce whether they want to keep their house. If they do so they are assigned their house, otherwise their house is added to the pool of vacant houses.

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	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
Endowment: Alice owns A	B	B	A
	A	C	B
	C	A	C

- ▶ Dictators' order: Carol, Bob, Alice.
- ▶ If all participate,

$$\mu(\text{Alice}) = C \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = A$$

Alice is better off not participating.

- ▶ Alice opts out. So we have

$$\mu'(\text{Alice}) = A \quad \mu'(\text{Bob}) = C \quad \mu'(\text{Carol}) = B$$

But Pareto dominated by

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⇒ This algorithm does not guarantee individually rational assignments. Risk averse tenants may prefer to opt out, resulting in inefficient assignments.

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A first solution to avoid the risk of tenants being worse off is the **Random Serial Dictatorship with Waiting Lists**.

At any step, an individual can only take a house that is **available**. This is the case when:

- ▶ the house is part of the public endowment; or
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An **obtainable house** is:

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**Step 1:** Draw a random order of **all** individuals.

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Run the serial dictatorship. If an existing tenant selects a different house than her endowment, the endowment is added to the set of available houses.

**Step  $k$ ,  $k \geq 3$ :** the set of available houses is constructed at the end of Step  $k - 1$ .

Run the serial dictatorship like in Step 2 with individuals not assigned yet.

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Endowment  $\rightarrow$

	$A$	$B$	$C$
$P_{\text{Alice}}$	$B$	$C$	$A$
$P_{\text{Bob}}$	$C$	$A$	$D$
$P_{\text{Carol}}$	$A$	$B$	$C$
	$D$	$D$	$B$

Public endowment:  $D$

Available houses:  $D$

Order of dictators: Alice, Bob and Chris.

- ▶ Step 2: Carol takes  $D$  ( $D$  not available for Alice and Bob).
- ▶ Step 3:  $C$  now available, Alice is first, she takes  $C$ .
- ▶ Step 4:  $A$  now available, Bob takes it.

Final assignment:

$$\mu(\text{Alice}) = C \quad \mu(\text{Bob}) = A \quad \mu(\text{Carol}) = D$$

But Pareto dominated by

$$\mu'(\text{Alice}) = B \quad \mu'(\text{Bob}) = C \quad \mu'(\text{Carol}) = A$$

$\Rightarrow$  this algorithm does not guarantee efficiency

	Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>
		$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
Public endowment:	<i>D</i>	<i>B</i>	<i>C</i>	<i>A</i>
		<i>C</i>	<i>A</i>	<i>D</i>
Available houses:	<i>D</i>	<i>A</i>	<i>B</i>	<i>C</i>
		<i>D</i>	<i>D</i>	<i>B</i>

Order of dictators: Alice, Bob and Chris.

- ▶ Step 2: Carol takes *D* (*D* not available for Alice and Bob).
- ▶ Step 3: *C* now available, Alice is first, she takes *C*.
- ▶ Step 4: *A* now available, Bob takes it.

Final assignment:

$$\mu(\text{Alice}) = C \quad \mu(\text{Bob}) = A \quad \mu(\text{Carol}) = D$$

But Pareto dominated by

$$\mu'(\text{Alice}) = B \quad \mu'(\text{Bob}) = C \quad \mu'(\text{Carol}) = A$$

$\Rightarrow$  this algorithm does not guarantee efficiency

Endowment $\rightarrow$		$A$	$B$	$C$
		$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
Public endowment:	$D$	$B$	$C$	$A$
Available houses:	$C$	$C$	$A$	$D$
		$A$	$B$	$C$
		$D$	$D$	$B$

Order of dictators: Alice, Bob and Chris.

- ▶ Step 2: Carol takes  $D$  ( $D$  not available for Alice and Bob).
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Endowment $\rightarrow$		$A$	$B$	$C$
		$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
Public endowment:	$D$	$B$	$C$	$A$
Available houses:	$A$	$C$	$A$	$D$
		$A$	$B$	$C$
		$D$	$D$	$B$

Order of dictators: Alice, Bob and Chris.

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Endowment  $\rightarrow$

	$A$	$B$	$C$
$P_{\text{Alice}}$	$B$	$C$	$A$
$P_{\text{Bob}}$	$C$	$A$	$D$
$P_{\text{Carol}}$	$A$	$B$	$C$
	$D$	$D$	$B$

Public endowment:  $D$

Available houses:

Order of dictators: Alice, Bob and Chris.

- ▶ Step 2: Carol takes  $D$  ( $D$  not available for Alice and Bob).
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Final assignment:

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Endowment  $\rightarrow$

	<i>A</i>	<i>B</i>	<i>C</i>
$P_{\text{Alice}}$	<i>B</i>	<i>C</i>	<i>A</i>
$P_{\text{Bob}}$	<i>C</i>	<i>A</i>	<i>D</i>
$P_{\text{Carol}}$	<i>A</i>	<i>B</i>	<i>C</i>
	<i>D</i>	<i>D</i>	<i>B</i>

Public endowment: *D*

Available houses:

Order of dictators: Alice, Bob and Chris.

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Final assignment:

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But Pareto dominated by

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Endowment  $\rightarrow$

	$A$	$B$	$C$
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$
	$B$	$C$	$A$
	$C$	$A$	$D$
	$A$	$B$	$C$
	$D$	$D$	$B$

Public endowment:  $D$

Available houses:

Order of dictators: Alice, Bob and Chris.

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But Pareto dominated by

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**Step 1:** Draw a random order of **all** individuals.

**Step 2:** Assign **tentatively** houses using serial dictatorship until a **squatting conflict** occurs: the requested house has a tenant **and all the remaining houses** are worse for the tenant. The **conflicting individual** is the one who picked the tenant's house.

**Step 3:** If there's a **squatting conflict**:

- ▶ The existing tenant is assigned her house.
- ▶ All assignments starting from the conflicting individual are cancelled.
- ▶ Resume serial dictatorship starting with the conflicting individual.

**End:** The algorithm stops when there is no house or individual left. At this point all tentative assignments are finalized.

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Endowment  $\rightarrow$

$A$	$B$	$C$	$D$	
$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
$C$	$D$	$E$	$C$	$D$
$D$	$E$	$C$	$E$	$E$
$E$	$B$	$D$	$D$	$C$
$A$	$C$	$B$	$B$	$A$
$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.



Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
- ▶ Denis: conflict! *C*, *E* and *D* are taken.  
conflicting individual: Bob.  
 $\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
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conflicting individual: Bob.  
 $\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
- ▶ Denis: conflict! *C*, *E* and *D* are taken.  
conflicting individual: Bob.  
 $\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

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- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
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conflicting individual: Bob.

$\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
- ▶ Denis: conflict! *C*, *E* and *D* are taken.  
conflicting individual: Bob.

$\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*
- ▶ Bob chooses *D*
- ▶ Carol chooses *E*
- ▶ Denis: conflict! *C*, *E* and *D* are taken.  
conflicting individual: Bob.  
 $\Rightarrow$  Bob and Carol's assignment are cancelled and Denis is assigned his house, *D*.

Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
	$E$	$B$	$D$	$D$	$C$
	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Bob chooses  $E$ , the next available house
- ▶ Carol: conflict!  $E$  and  $C$  are taken.  
conflicting individual: Alice.  
 $\Rightarrow$  Alice and Bob's assignment are cancelled and Carol is assigned her house,  $C$ .

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Bob chooses *E*, the next available house
- ▶ Carol: conflict! *E* and *C* are taken.

conflicting individual: Alice.

$\Rightarrow$  Alice and Bob's assignment are cancelled and Carol is assigned her house, *C*.



$A$	$B$	$C$	$D$	
$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
$C$	$D$	$E$	$C$	$D$
$D$	$E$	$C$	$E$	$E$
$E$	$B$	$D$	$D$	$C$
$A$	$C$	$B$	$B$	$A$
$B$	$A$	$A$	$A$	$B$

- ▶ Bob chooses  $E$ , the next available house
- ▶ Carol: conflict!  $E$  and  $C$  are taken.  
conflicting individual: Alice.

Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
	$E$	$B$	$D$	$D$	$C$
	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Bob chooses  $E$ , the next available house
- ▶ Carol: conflict!  $E$  and  $C$  are taken.  
conflicting individual: Alice.  
 $\Rightarrow$  Alice and Bob's assignment are cancelled and Carol is assigned her house,  $C$ .

Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
	$E$	$B$	$D$	$D$	$C$
	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses  $E$ , the next available house.
- ▶ Bob chooses  $B$ .
- ▶ Erin chooses  $A$ .
- ▶ The algorithm stops, final allocation:

$$\begin{aligned} \mu(\text{Alice}) = E \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = C \quad \mu(\text{Denis}) = D \\ \mu(\text{Erin}) = A \end{aligned}$$

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *E*, the next available house.
- ▶ Bob chooses *B*.
- ▶ Erin chooses *A*.
- ▶ The algorithm stops, final allocation:

$$\begin{aligned} \mu(\text{Alice}) = E \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = C \quad \mu(\text{Denis}) = D \\ \mu(\text{Erin}) = A \end{aligned}$$

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *E*, the next available house.
- ▶ Bob chooses *B*.
- ▶ Erin chooses *A*.
- ▶ The algorithm stops, final allocation:

$$\mu(\text{Alice}) = E \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = C \quad \mu(\text{Denis}) = D$$

$$\mu(\text{Erin}) = A$$

Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *E*, the next available house.
- ▶ Bob chooses *B*.
- ▶ Erin chooses *A*.
- ▶ The algorithm stops, final allocation:

$$\mu(\text{Alice}) = E \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = C \quad \mu(\text{Denis}) = D$$

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Endowment $\rightarrow$	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$\textcircled{C}$	<i>D</i>	$\textcircled{E}$	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	$\textcircled{B}$	<i>D</i>	$\textcircled{D}$	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	$\textcircled{A}$
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

But this assignment is Pareto dominated by:

$$\begin{aligned} \mu(\text{Alice}) = C \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = E \quad \mu(\text{Denis}) = D \\ \mu(\text{Erin}) = A \end{aligned}$$

# Two efficient solutions

The MIT-NH4, Rochester or Carnegie-Mellon/Duke/Harvard mechanisms show that finding an **efficient** and **individually rational** assignment is not trivial.

There is a way out, though. Use either:

- ▶ An improved version of the MIT-NH4 algorithm; or
- ▶ the Top Trading Cycle algorithm.

These solutions turn out to have an additional property: they are both **strategyproof**.



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# Improving the MIT-NH4 mechanism

The issue is how conflicts defined and solved:

## ▶ MIT-NH4:

If there is a conflict: **all tenant's acceptable houses taken.**

- ▶ All assignments starting from the conflicting individual are cancelled;
- ▶ Existing tenant is assigned her house;
- ▶ Resume serial dictatorship starting from the conflicting individual.

## ▶ You Request My House — I Get Your Turn:

If there is a conflict: **the tenant hasn't chosen a house yet.**

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# You Request My House — I Get Your Turn

**Step 1:** Draw a random order of **all** individuals.

**Step 2:** Assign **tentatively** houses using serial dictatorship until a **squatting conflict** occurs.

**Step 3:** If there is a **squatting conflict**:

- ▶ All assignments starting from the conflicting individual are cancelled.
- ▶ In the ordering of individuals move the existing tenant just above the conflicting individual.
- ▶ Resume serial dictatorship starting with the existing tenant.

**Step 4:** If there is a **cycle**, assign the houses (like in TTC) and remove the individuals and houses in the cycle from the problem.

**End:** The algorithm stops when there are no house or individual left.

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Endowment  $\rightarrow$

$A$	$B$	$C$	$D$	
$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
$C$	$D$	$E$	$C$	$D$
$D$	$E$	$C$	$E$	$E$
$E$	$B$	$D$	$D$	$C$
$A$	$C$	$B$	$B$	$A$
$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

Endowment  $\rightarrow$

	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
	<i>B</i>	<i>A</i>	<i>A</i>	<i>A</i>	<i>B</i>

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses *C*, but tenant (Carol) hasn't chosen a house yet.
- ▶ Carol chooses *E*, then Alice chooses *C*.
- ▶ Bob chooses *D*, but tenant (Denis) hasn't chosen a house yet.

New order: Carol, Alice, Denis, Bob and Erin.

- ▶ Denis chooses *D*. A trivial cycle, so Denis is assigned *D*.

Endowment  $\rightarrow$

$A$	$B$	$C$	$D$	
$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
$C$	$D$	$E$	$C$	$D$
$D$	$E$	$C$	$E$	$E$
$E$	$B$	$D$	$D$	$C$
$A$	$C$	$B$	$B$	$A$
$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses  $C$ , but tenant (Carol) hasn't chosen a house yet.

**New order: Carol, Alice, Bob, Denis and Erin.**

- ▶ Carol chooses  $E$ , then Alice chooses  $C$ .
- ▶ Bob chooses  $D$ , but tenant (Denis) hasn't chosen a house yet.

**New order: Carol, Alice, Denis, Bob and Erin.**

- ▶ Denis chooses  $D$ . A trivial cycle, so Denis is assigned  $D$ .



Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
	$E$	$B$	$D$	$D$	$C$
	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses  $C$ , but tenant (Carol) hasn't chosen a house yet.

New order: Carol, Alice, Bob, Denis and Erin.

- ▶ Carol chooses  $E$ , then Alice chooses  $C$ .
- ▶ Bob chooses  $D$ , but tenant (Denis) hasn't chosen a house yet.

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Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
	$E$	$B$	$D$	$D$	$C$
	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Alice, Bob, Carol, Denis and Erin.

- ▶ Alice chooses  $C$ , but tenant (Carol) hasn't chosen a house yet.

New order: Carol, Alice, Bob, Denis and Erin.

- ▶ Carol chooses  $E$ , then Alice chooses  $C$ .
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New order: Carol, Alice, Denis, Bob and Erin.

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Endowment  $\rightarrow$

	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
	<i>D</i>	<i>E</i>	<i>C</i>	<i>E</i>	<i>E</i>
	<i>E</i>	<i>B</i>	<i>D</i>	<i>D</i>	<i>C</i>
	<i>A</i>	<i>C</i>	<i>B</i>	<i>B</i>	<i>A</i>
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**New order: Carol, Alice, Denis, Bob and Erin.**

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Endowment  $\rightarrow$

	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	<i>C</i>	<i>D</i>	<i>E</i>	<i>C</i>	<i>D</i>
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Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
	$D$	$E$	$C$	$E$	$E$
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	$A$	$C$	$B$	$B$	$A$
	$B$	$A$	$A$	$A$	$B$

Order of dictators: Carol, Alice, Denis, Bob and Erin.

- ▶ Bob chooses  $B$ . A trivial cycle, so Bob is assigned  $B$ .
- ▶ Erin chooses  $A$ . Tenant (Alice) has chosen a house.
- ▶ The algorithm stops, final allocation:

$$\mu(\text{Alice}) = C \quad \mu(\text{Bob}) = B \quad \mu(\text{Carol}) = E \quad \mu(\text{Denis}) = D$$

$$\mu(\text{Erin}) = A$$

Endowment $\rightarrow$	$A$	$B$	$C$	$D$	
	$P_{\text{Alice}}$	$P_{\text{Bob}}$	$P_{\text{Carol}}$	$P_{\text{Denis}}$	$P_{\text{Erin}}$
	$C$	$D$	$E$	$C$	$D$
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Order of dictators: Carol, Alice, Denis, Bob and Erin.

- ▶ Bob chooses  $B$ . A trivial cycle, so Bob is assigned  $B$ .
- ▶ Erin chooses  $A$ . Tenant (Alice) has chosen a house.
- ▶ The algorithm stops, final allocation:

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With YGMH—IGYT changing the order of dictators can yield to endless loops.

$$\text{Endowment} \rightarrow \begin{array}{c|c} A & B \\ \hline P_{\text{Alice}} & P_{\text{Bob}} \\ \hline B & A \\ A & B \end{array}$$

- ▶ Order is: Alice, Bob.
- ▶ Alice chooses  $B \Rightarrow$  order changed to: **Bob, Alice**
- ▶ Bob chooses  $A \Rightarrow$  order changed to: **Alice, Bob**
- ▶ repeat, ad nauseam.

Alice and Bob create a **loop**. The YGMH—IGYT algorithm states that in this case we do like TTC:

- ▶ Alice takes  $B$
- ▶ Bob takes  $A$



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$$\text{Endowment} \rightarrow \begin{array}{cc} A & B \\ \hline P_{\text{Alice}} & P_{\text{Bob}} \\ \hline B & A \\ A & B \end{array}$$

- ▶ Order is: Alice, Bob.
- ▶ Alice chooses  $B \Rightarrow$  order changed to: Bob, Alice
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- ▶ repeat, ad nauseam.

Alice and Bob create a **loop**. The YGMH—IGYT algorithm states that in this case we do like TTC:

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# Top Trading Cycle with mixed endowments

This algorithm works like TTC when the objects have a priority:

- ▶ Individuals point to the house they want.
- ▶ Houses point to an individual.

To which individual will the house point?

- ▶ Draw a random order of the individuals.

This order will become will become the priority ordering over individuals of **all vacant houses**.

- ▶ Occupied house point to their tenants.

Then run TTC.

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# Results

## Theorem

*An assignment mechanism that uses the Top Trading Cycle algorithm with mixed endowment is (for any random ordering):*

- ▶ *Efficient.*
- ▶ *Individually rational.*
- ▶ *Strategyproof*

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*For any ordering of the individuals the YRMH-IGYT algorithm yields the same outcome as the Top Trading Cycle algorithm with mixed endowments (using the same ordering of the individuals).*



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# Take-away

- ▶ In **assignment models** we have to match individuals to **objects**.
- ▶ Individuals have preferences over objects, but objects **do not** have preferences.

⇒ Only individuals' welfare matter.

- ▶ Two cases: **public endowments** & **private endowments**.

There is also the mix public-private endowment model.

- ▶ Serial dictatorship is a simple algorithm that is **efficient** and makes a mechanism using it **strategyproof**.

- ▶ The **Top Trading Cycle** algorithm is another solution that gives **efficient** assignments and ensures **strategyproofness**.

TTC needs either:

- ▶ private endowments; or
  - ▶ each object has a **priority orderings** over the individuals.
- ▶ Serial dictatorship does not ensures **individually rational** assignments when there are private endowments.
- ▶ With private endowments, **individual rationality**, **efficiency** and **strategyproofness** can be obtain with either:
    - ▶ the **You Get My House — I Get Your Turn** algorithm; or
    - ▶ the **Top Trading Cycle with Mixed Endowments** algorithm.

Both algorithms yield the same outcome.