

# Course overview and logistics

## CS639: Algorithmic Game Theory & Learning

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# Game theory

A mathematical framework for modelling interactions between multiple **strategic and selfish** agents (players).

- Agents view the interaction as a “*game*”.
- Each agent is trying to “*win the game*”.
- Agents could be partially competitive and partially cooperative.
- Agents: people, organizations, countries, robots.

# Example 1: Prisoner's dilemma

Two robbers are caught after committing a robbery together. They are each given the option to ***betray*** ***their partner*** or ***remain loyal***.

		Prisoner B	
		Betray	Remain loyal
Prisoner A	Betray	A serves 3 years, B serves 3 years	A goes free, B serves 5 years
	Remain loyal	A serves 5 years, B goes free	A serves 1 years, B serves 1 years

# Prisoner's dilemma in the real world

1. Individually, countries find it beneficial to develop nuclear weapons.

- But the mutually better outcome is if no country had nuclear weapons.

2. Competing firms lower prices to attract customers.

- But best if they collectively keep prices high.
- **Counter-examples:** OPEC, Cable/wireless companies in the US.

## Example 2: Tragedy of the commons

A common resource can be used by some agents.

- Each agent benefits by using the resource.
- It is collectively better for all agents to use less of the resource.
- However, it is better for each individual agent to use more. This leads to socially less desirable outcomes.

# Tragedy of the commons in the real world

1. Individual fishermen compete to catch as much fish as possible.
  - But over-fishing will deplete the fish population over time.
2. Individually, plastic consumption is convenient and does not affect the environment significantly.
  - But collectively, plastic consumption is not sustainable.

**Counter-measures via regulations:** Restrictions on overfishing,  
Pay for single-use plastic bags.

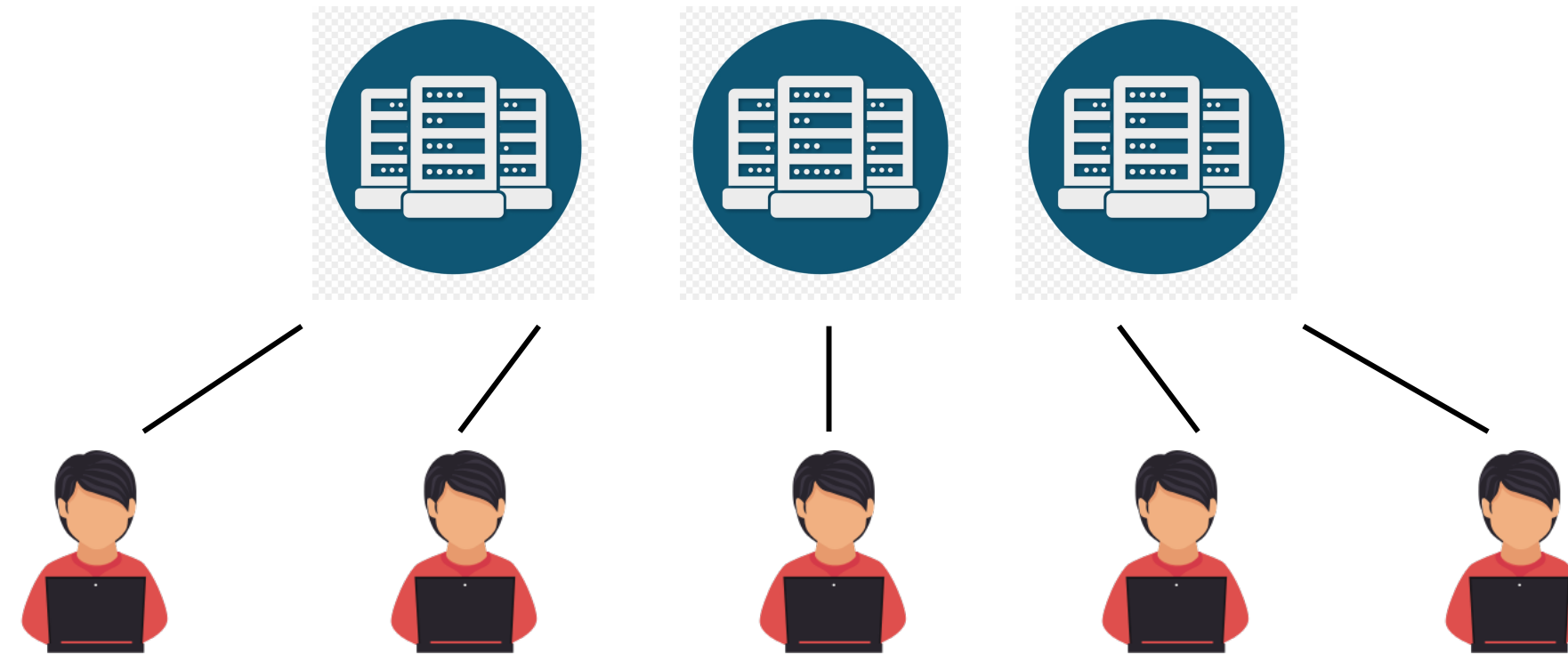
# Mechanism design

The design of games, i.e social interactions, to obtain desirable social outcomes when agents are acting in self-interest.

- “Inverse” game theory
- Ideally, there would be an “obvious” strategy that leads to the desired outcome. (Not always possible)



# Example 1: Resource allocation in clusters



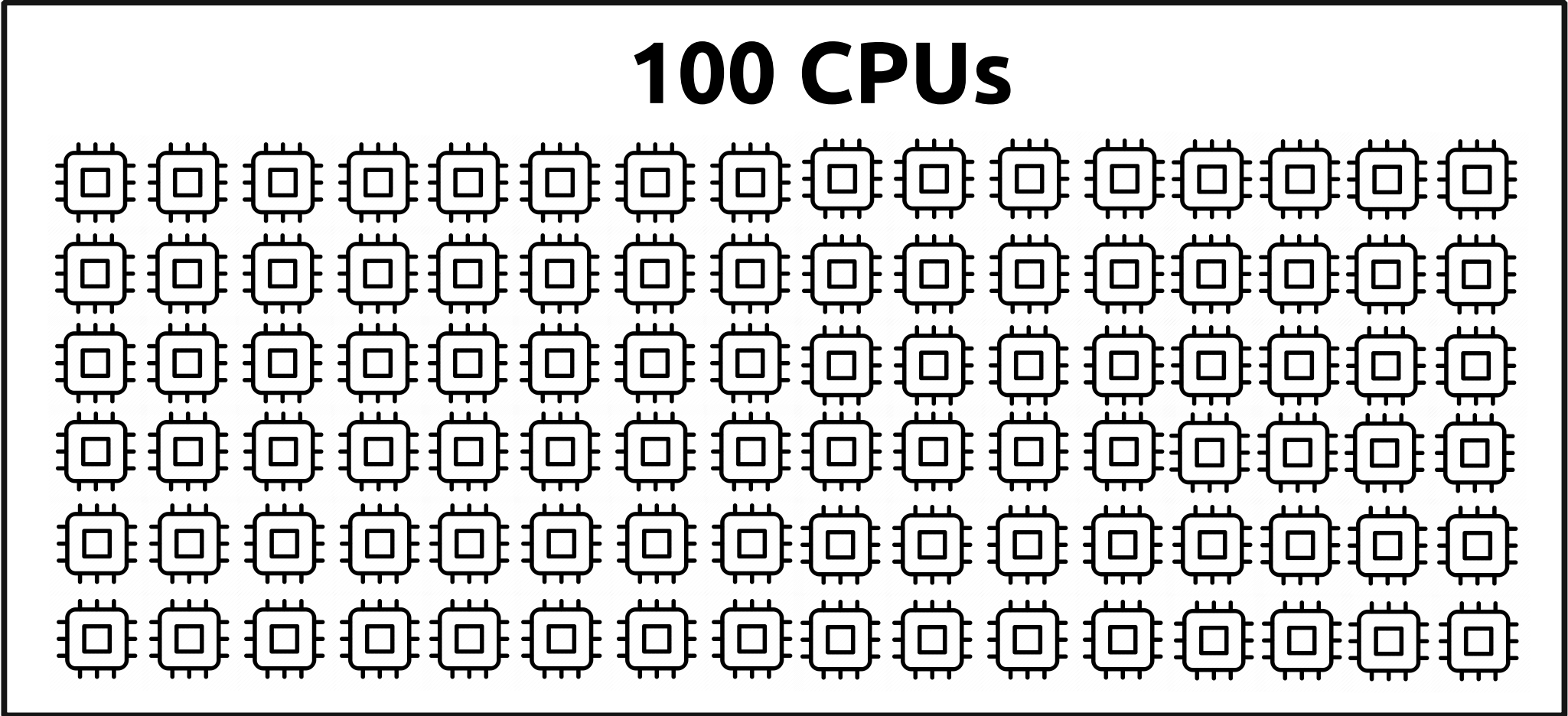
Several users are sharing a compute cluster. How do you allocate the resources among them?

- Users are *competing* for the *finite* amount of resources. Usually demand exceeds supply.
- Users want to “win this game”, i.e try to get more resources for themselves. *E.g “if I ask more, I will get more”*.
- Users wish to be treated fairly.

If managed poorly, this is an example of the tragedy of the commons.



# Fair resource allocation in clusters

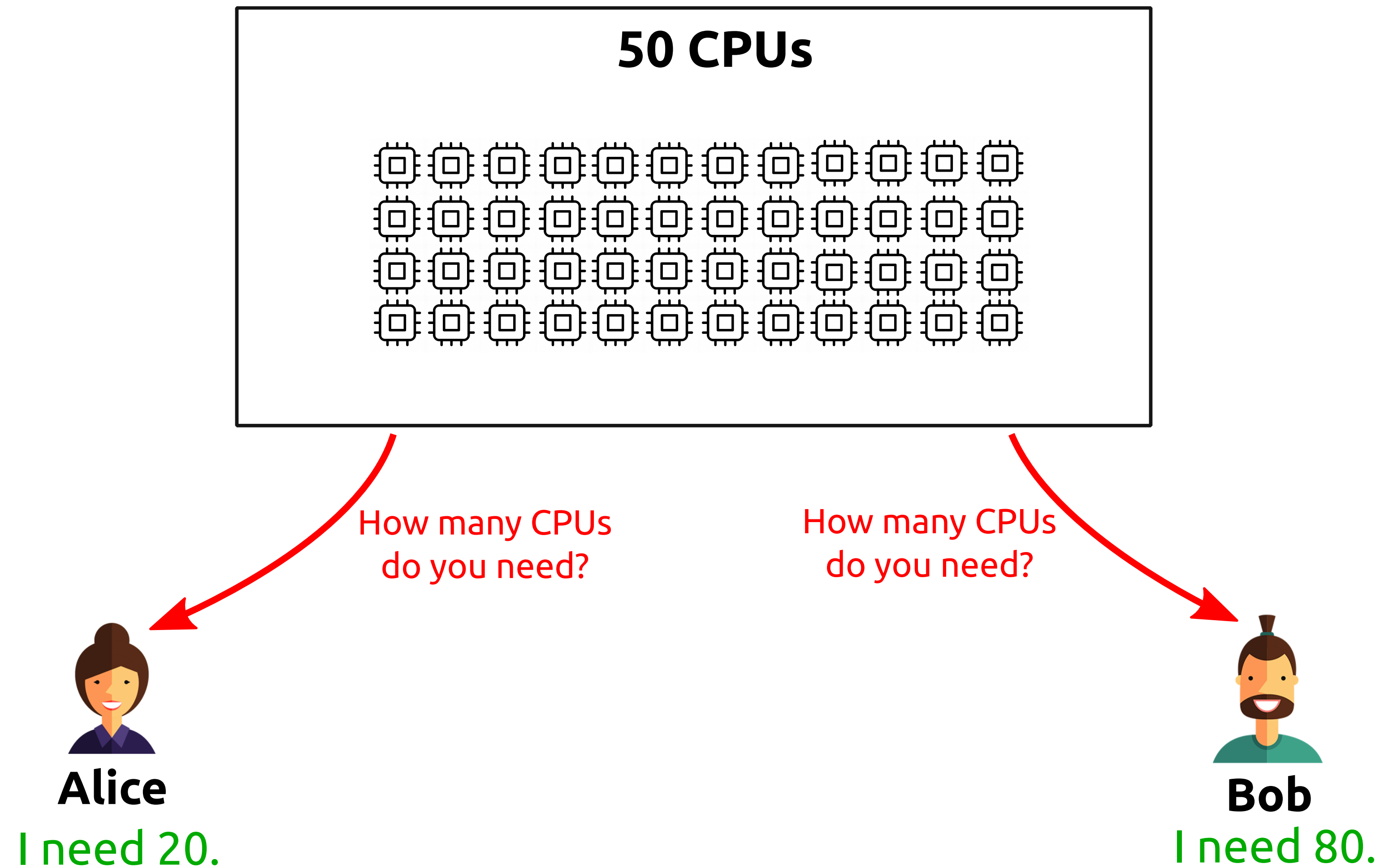


**Alice**



**Bob**

# Fair resource allocation under scarcity

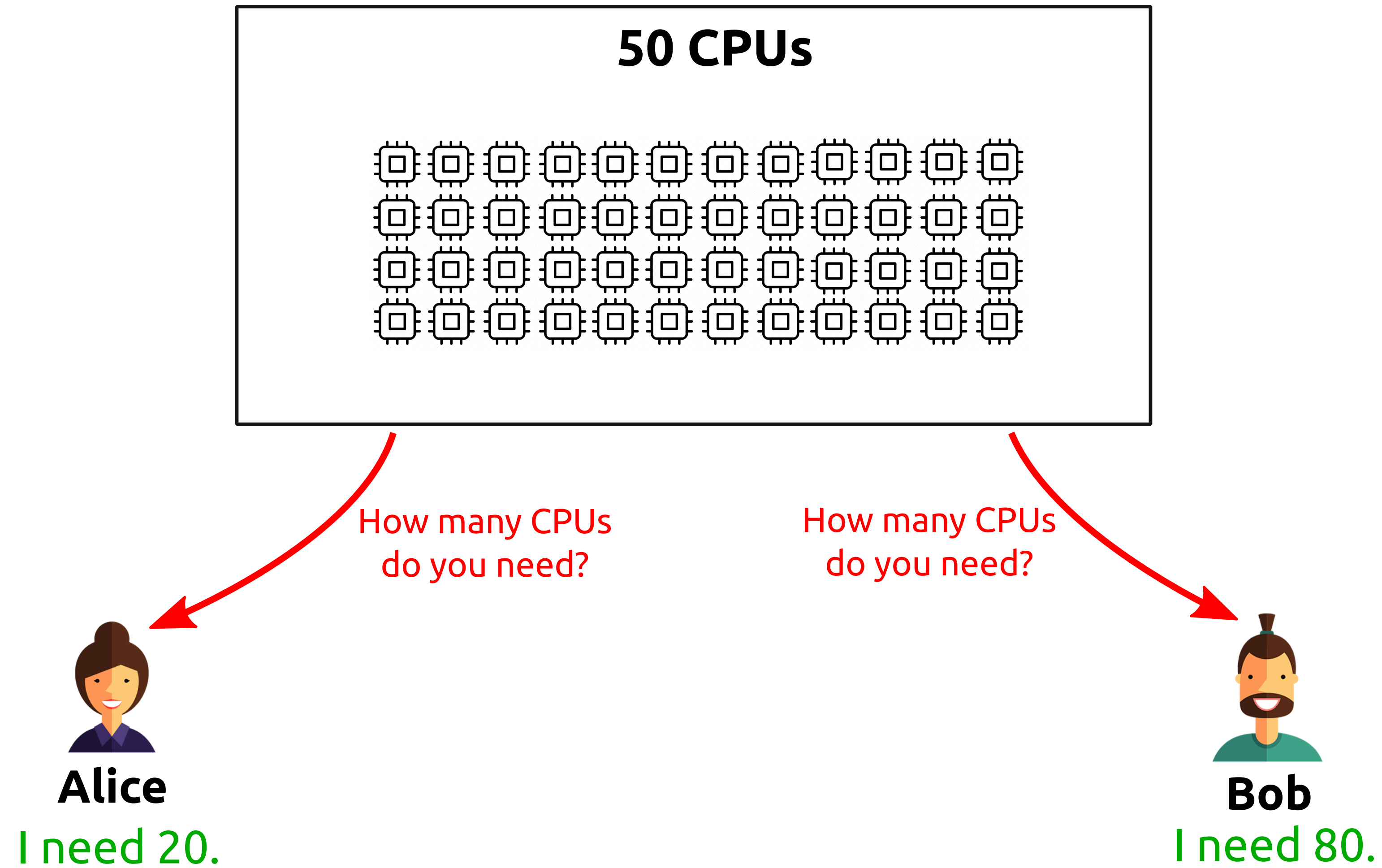


**Cluster manager:**  
Let me try allocating proportionally

**Issue 1:**  
**Alice:** this is not fair!  
My fair share is 25 CPUs.

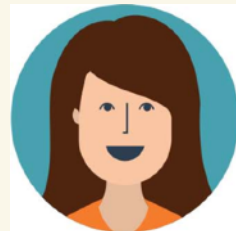
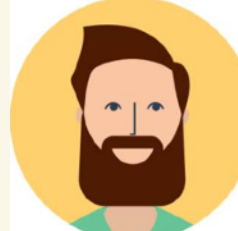
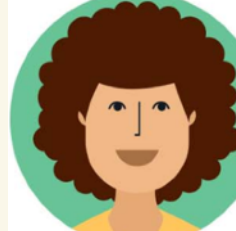

**Issue 2:**  
**Bob:** If I request more than 80, I will get more than 40.  
**Alice:** I also need to request more.

# Are there better solutions?



# The Max-min fairness *mechanism*





- we will study this in detail later in class

100 CPUs, 4 Users	 <b>Carol</b>	 <b>Dave</b>	 <b>Eve</b>	 <b>Frank</b>
Demands	50	26	10	80
Rnd 1: fair share	25	25	25	25
Allocation			10	
Rnd 2: fair share	30	30	-	30
Allocation		26	-	
Rnd 3: fair share	32	-	-	32
Allocation	32	-	-	32

# The Max-min fairness *mechanism*

Properties of this mechanism:

- 1. No incentives for agents to ask for more.
- 2. Fair (*a user will either fully satisfy her demand or receive at least her fair share*)
- 3. No resource wastage

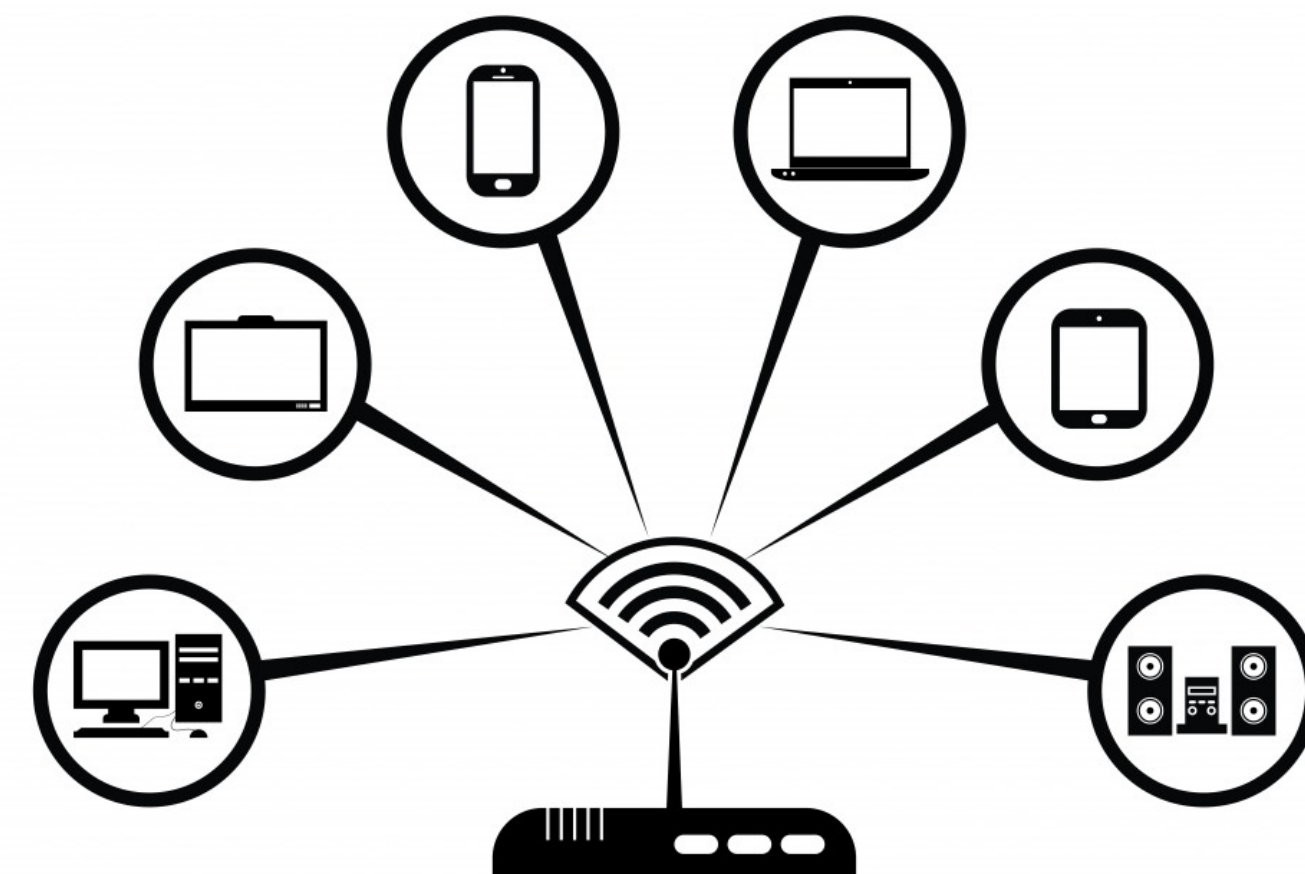
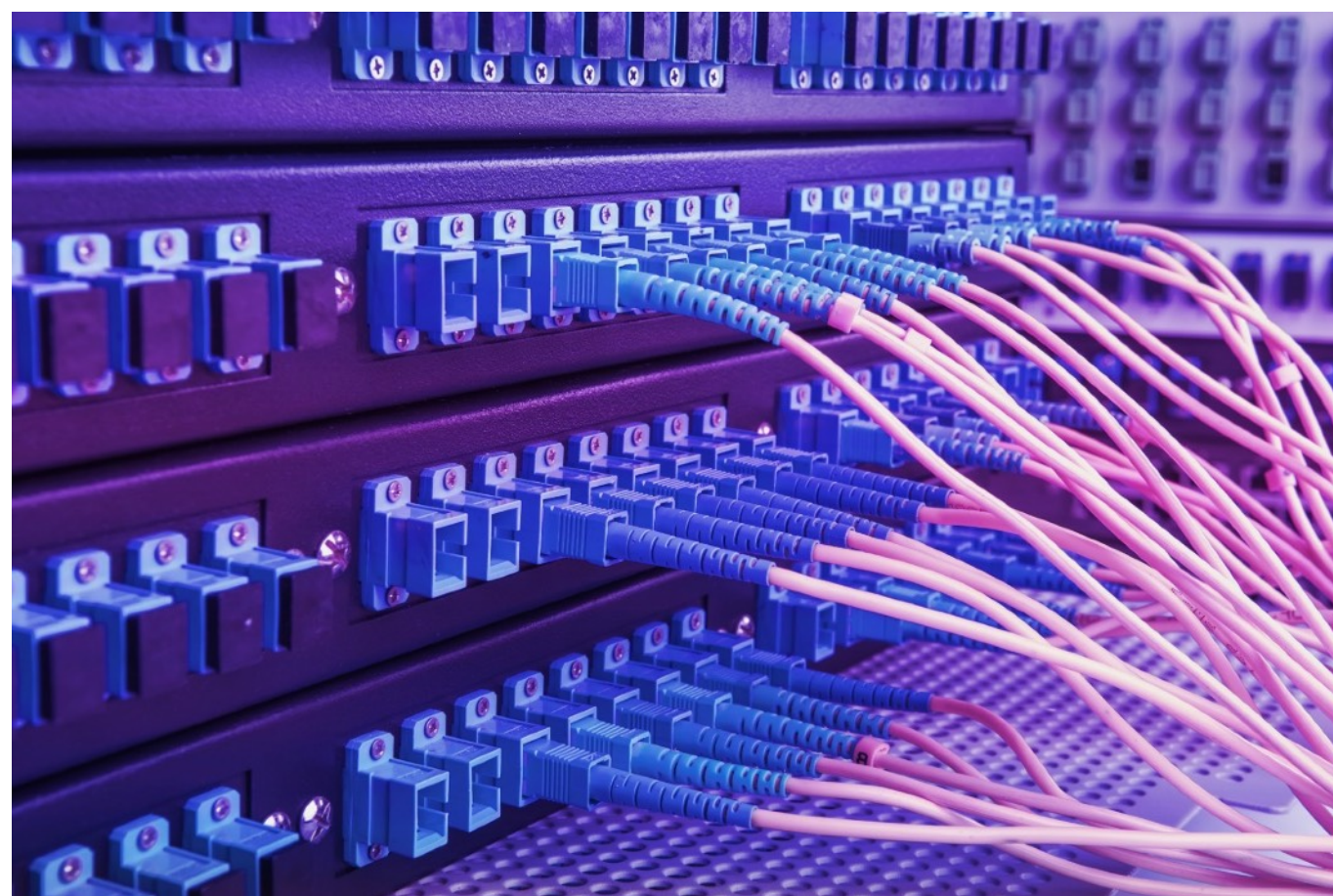
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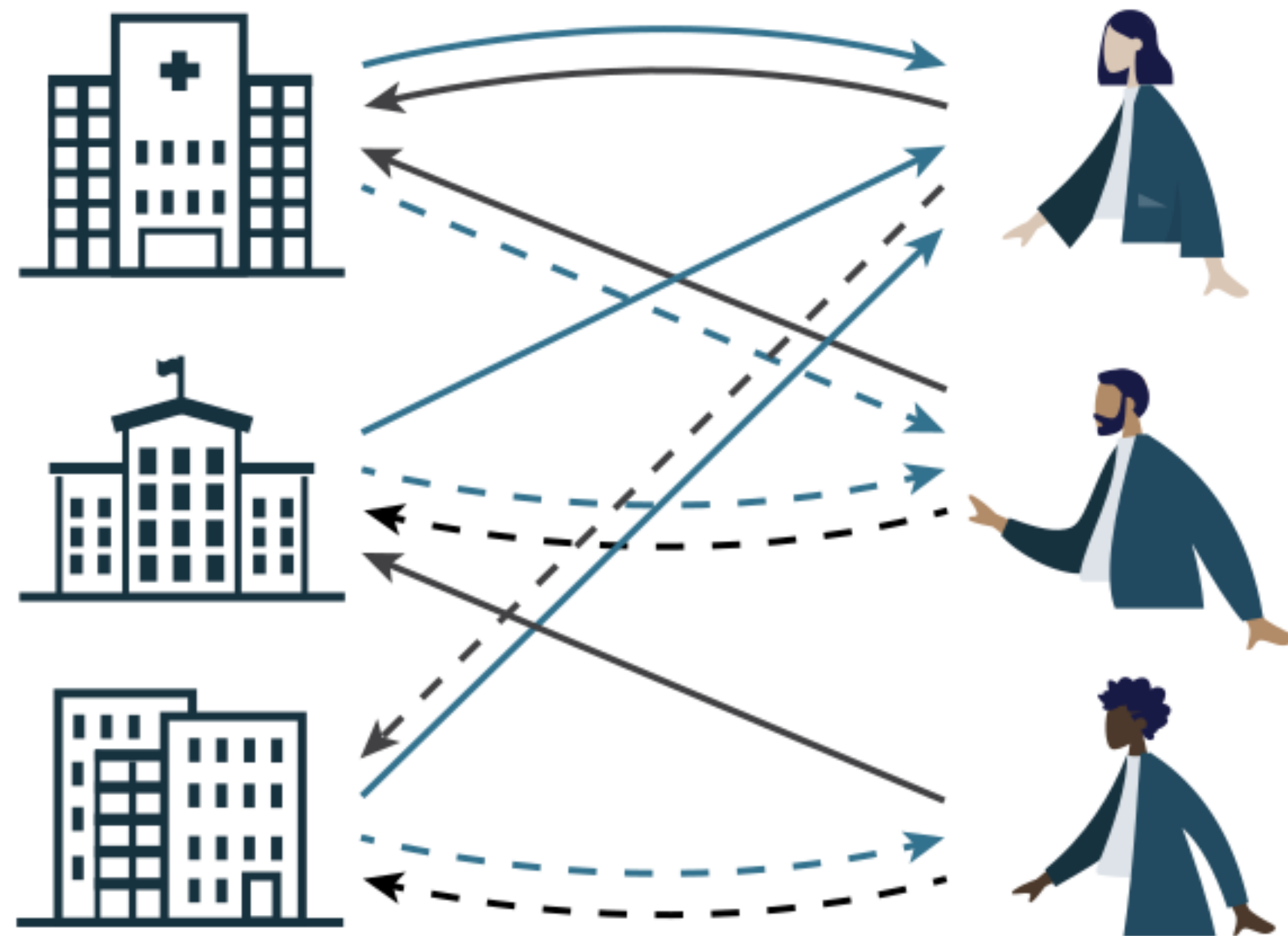
# Fair resource allocation in real world cluster managers



## Bandwidth allocation in WIFI and Broadband



# Example 2: Stable matching



## NRMP: National Residency Matching Program

Each year medical school graduates apply to the NRMP.

Hospitals rank the residents.

Residents can rank up to  $N$  hospitals (In NRMP,  $N = 20$ ).

**Goal:** Match residents to hospitals based on submitted rankings.



# Cooperative Game Theory

A framework for studying situations where agents can make a mutually beneficial agreement, but have a conflict of interest about which agreement to make.

# Example: How to divide wealth created?

Two workers decide to team up to produce tables.

- On their own, they can each make \$10 per day.
- If they work together, they can make \$100 per day.



Working together is clearly beneficial. But how do they split up the \$100 between them?

**\$50 each seems natural.**

# Example (cont'd): How to divide wealth created?

A worker and employer decide to team up to produce tables.

- An employer on her own can make \$50 per day.
- The worker on her own can make \$10 per day.
- If they work together, they can make \$100 per day.



Working together is clearly beneficial. But how do they split up the \$100 between them?

**No, one right solution.**

- ▶ But in any solution, employer gets at least \$50, worker gets at least \$10. Otherwise, they will not be willing to work together.
- ▶ **Axiomatic bargaining** provides a framework to split the remaining \$40.

# Some desirable properties

## Necessary

- *Individual rationality*: Employer should get at least \$50, worker should get at least \$10. Otherwise, they will not be willing to work together.

## Nice to have

- The total allocation should be \$100.
- Scale invariance. (E.g allocation should not change if we do the calculation in cents and not dollars.)
- Anonymity: changing labels of agents should not change allocation.

Other nice properties we will explore in class.

# Outline

1. Course logistics
2. Grading
3. Syllabus
4. Who should take this class? Prerequisites and expectations

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# Lectures, Enrollment

- **Lectures**

- Tuesday & Thursday, 11 am - 12.15 pm at Psychology 103
- Lectures will be on slides, with mathematically intensive portions written out on a tablet and projected.
- *Complete* slides will be made available prior to class, but are not a substitute for attending lectures.

- **Enrollment**

- At capacity. A few on the waitlist.
- Continue to come to class, some students will likely drop.



# Recommended material

- Recommended textbook: **Game Theory, Alive** by Anna Karlin & Yuval Peres
- Other useful resources
  - Algorithmic Game Theory, by Nisan, Roughgarden, Tardos, Vazirani.
  - Tim Roughgarden's lecture notes, Incentives in Computer Science, Algorithmic Game Theory.
  - Amy Greenwald's lecture notes, Topics In Algorithmic Game Theory.

# Course staff, Office hours

- **Instructor:** Kirthi Kandasamy
  - OHs: Tue 2.00 - 3.30 pm, MH 5506
  - E-mail: kandasamy [at] cs.wisc.edu.
- **Grader:** David Zinkel

# Webpages

- **Course website**

- [pages.cs.wisc.edu/~kandasamy/courses/26spring-cs639/](https://pages.cs.wisc.edu/~kandasamy/courses/26spring-cs639/)
- General course information, syllabus, schedule, homeworks, and grading

- **Piazza**

- [piazza.com/wisc/spring2026/cs639005](https://piazza.com/wisc/spring2026/cs639005)
- Announcements, peer discussions on lectures, homework clarifications.
- As a general rule, I will **not** be checking Piazza regularly.

- **Canvas**

- Homeworks (and some announcements)
- Please do not share material posted on canvas outside the classroom.

# Contacting the Instructor

- Please read the course website and previous Piazza posts before you ask us.
- If you decide to contact me:
  1. OHs > Public piazza post > private piazza message > email
  2. If you think others will benefit from the answer, please ask as a public question on Piazza.
  3. Keep questions as concise as possible.

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# Grading

- Proofreading slides and class participation: 10%
- Homeworks: 30%
- Midterm: 30%
- Final: 30%

# Proofreading slides and class participation

- Each student will proofread 2-4 lectures. Two students per lecture. (This may change if enrolment drops.) See course website for sign-up link
- **Instructions (see course website as well)**
  - Proofreaders **must** attend class.
  - After class, carefully read and identify typos, errors, and unclear explanations.
  - Within **2 days**, each student should **email separate submissions**, either marked on downloaded slides or typed up as a separate pdf.
  - If you are unsure about taking the class, sign up for after Feb 23. If you decide to drop, *delete your name **and** email me.*
  - After you sign up, please don't change your slot without informing me.



# Exams

- **Midterm: 30%**
  - Time: TBD, but likely sometime between Mar 16 - Mar 27 (likely Mar 16-20).  
**Do not make spring break travel plans for now.**
  - Location TBD.
- **Final: 30%**
  - Wednesday 05/06/2026 12.25 PM – 2.25 PM.
  - Location TBD.
- **Make-up exams:**
  - Only for *documented* emergencies and conference travel.
  - Otherwise, up to a 33% penalty.

# Homework (30% of grade)

Read course webpage for all details,

- Homework 0, and another 6 Homeworks.
- Should be typeset (no written and scanned homeworks).
- Homeworks *will be difficult*.
  - Expect to spend multiple hours/days on some problems.
  - Unless otherwise specified, you *are allowed* to collaborate with up to 2 classmates.
- Do **not** release questions outside of class, or discuss them in public forums.

# Homework (cont'd)

- Late homework policy:
  - You have 4 total late days to be used throughout the semester.
  - After that, 50% of score if you submit 2 days after the deadline, and 0% if you are later than 2 days.
  - Extensions are **very unlikely**, and will be *considered* only for documented emergencies, travel to academic conferences, and paper deadlines.
  - There are additional rules and we will follow them strictly. Please read the course website.

# Homework (cont'd)

- Using LLM-based tools in your homework:
  - You are allowed to use LLM tools, however, if you entirely use LLMs to generate solutions, you will be very unprepared for your midterm and final.
  - Recommended way to use LLMs:
    - Always attempt the problem on your own first. After completing a solution, you may use an LLM to check your work.
    - If you are stuck after substantial effort (at least several hours), you may use an LLM for high-level guidance (e.g., how to approach the problem).
    - If you are still stuck (after a day or two), you may generate a solution using an LLM, but you must understand it fully, verify its correctness, and write the solution in your own words.

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# Syllabus: Overview

- 1. General sum games (4-6 lectures)
  - 2. Zero sum games (1-2 lectures)
  - 3. Solving games via linear programming (1-2 lectures)
  - 4. Online learning (1-2 lectures)
  - 5. Learning in games (3-4 lectures)
  - 6. Mechanism design without money (4-6 lectures)
  - 7. Mechanism design with money (3-5 lectures)
  - 8. Cooperative game theory (2-3 lectures)
  - 9. Truthful information elicitation (*if time permits*)
- Part I: Game theory fundamentals**
- Part II: Learning in games**
- Part III: Mechanism design**
- Part IV: Other topics**

# I. Game theory fundamentals (Ch 1-3)

Basic tools to analyze games and predict behaviour of agents.

- General-sum games, equilibrium concepts
- Zero sum games, minimax theorem
- Potential games
- Price of anarchy/stability
- Computing equilibria via linear programming



## II. Learning in games (Ch 4-5)

Modern topics in the intersection of ML, Game theory, and mechanism design

- Introduction to online learning
- Using online learning to approximate equilibria
- Proof of minimax theorem

# III. Mechanism Design (Ch 6-7)

Designing games to achieve socially desirable outcomes. We will focus on common desiderata such as, individual rationality, incentive compatibility, fairness, and efficiency.

Applications: Auctions, Kidney exchange, Fair resource allocation, Stable matching

## IV. Other topics (Ch 8)

**Cooperative game theory:** Dividing the value created when agents can cooperate to create more than the sum of their parts.

- Coalitional games
  - The core, Shapley value
- Axiomatic bargaining
  - Nash, utilitarian, and egalitarian solutions

## IV. Other topics (Ch 9)

**Truthful information elicitation** (if time permits):

Designing rewards to truthfully elicit information from agents.

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# Target audience for the class

- Advanced undergraduate and early graduate students with a strong background in mathematics
- **Background knowledge**
  - **Formal prerequisites:** (CSVMATH 240 or CSVMATH/STAT 475) and (MATH 320, 340, 341, 345 or 375).
  - Background in calculus, linear algebra, and probability.
  - Mathematical maturity, should be comfortable with proofs and logical reasoning.
- **No review** of background topics
  - But, if it is a new mathematical concept, I may explain things **once**.

# Syllabus: Overview

- 1. General sum games (4-6 lectures)
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  - 9. Truthful information elicitation (*if time permits*)
- Part I: Game theory fundamentals**
- Part II: Learning in games**
- Part III: Mechanism design**
- Part IV: Other topics**

# Homework 0

## Three questions:

1. Mathematics background **(no collaboration on this question)**
2. Game theory: studying a simple game with tragedy of the commons
3. Cooperative game theory: A bargaining problem

## Three Objectives

- I. A preview of what's to come
- II. Calibrate my teaching/expectations
- III. Lets you assess if you are ready to take this class



# General advice when taking this class

1. Focus on learning, and not on grades.
  - Class will be challenging. But if you are able to keep up, you will get a good grade.
2. Give me feedback about the course.
3. Be good citizens: attend class, ask questions, answer questions, let others answer/ask questions, respond to questions on piazza.