

# Network Bargaining Games and Cooperative Game Theory

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# Bargaining



# Bargaining

- Common wisdom has it that the whole is more than the sum of the parts.
- Two **cooperative** agents are often capable of generating a **surplus** that neither could achieve alone.
  - Trade creates value
  - Music studio, Music band - sell an album
  - Publishing house, author - print and sell a book
  - Job position
  - Partnership formation

# Example

- Bargaining over a division of a cake
- Take-it-or-leave-it rule
  - I offer you a piece.
  - If you accept, we trade.
  - If you reject, no one eats.
- What is the equilibrium?
  - Power to the proposer.





# Example

- Bargaining over a division of a cake
- Take-it-or-counteroffer rule
  - I offer you a piece.
  - If you accept, we trade.
  - If you reject, you may counteroffer (and  $\delta$  of the cake remains, the rest melt)
- What is the equilibrium?

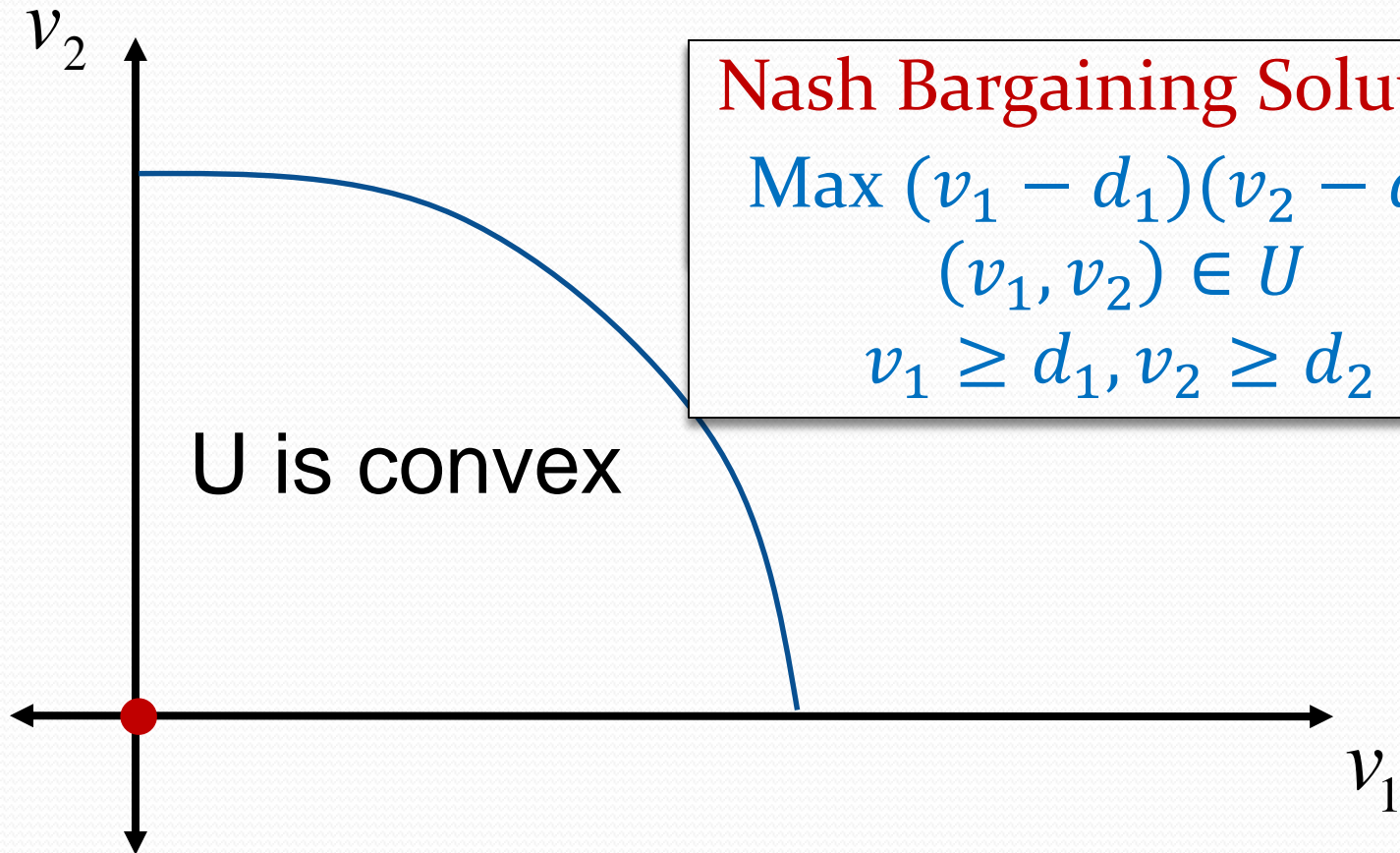


# Bargaining

What would be the outcome?

What is the right solution?

# Nash Bargaining Solution



# Nash Bargaining Solution

- Pareto Efficiency

- $\nexists (v_1, v_2) \in U$  s.t.  $v \geq f(U, d)$  and  $\exists i$  s.t.  $v_i > f_i(U, d)$

- Symmetry

- If  $U$  is symmetric and  $d_1 = d_2$  then  $f_1(U, d) = f_2(U, d)$

- Invariant to Equivalent Payoff Representation

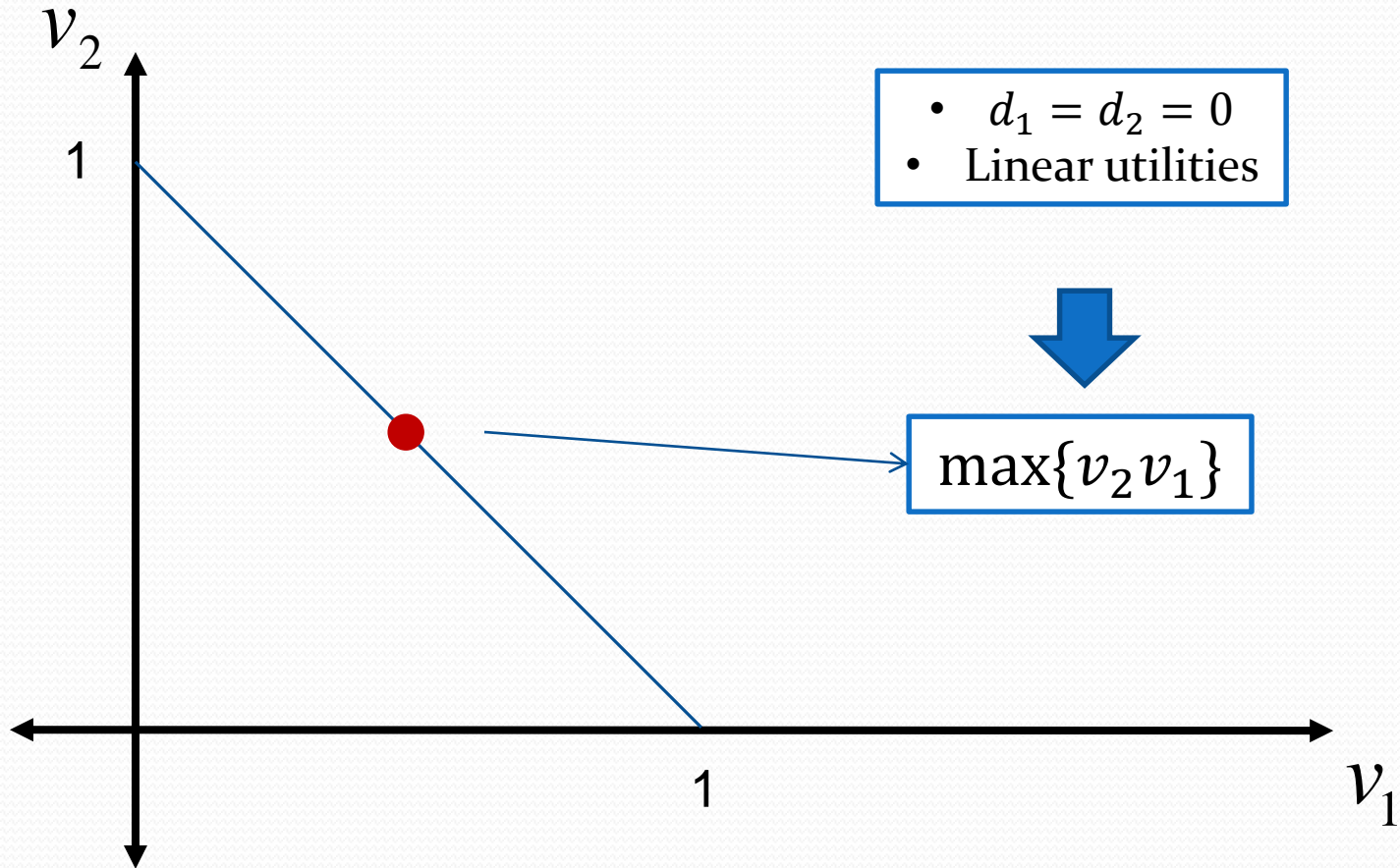
- Invariant to affine transform

- Independence of Irrelevant Alternatives

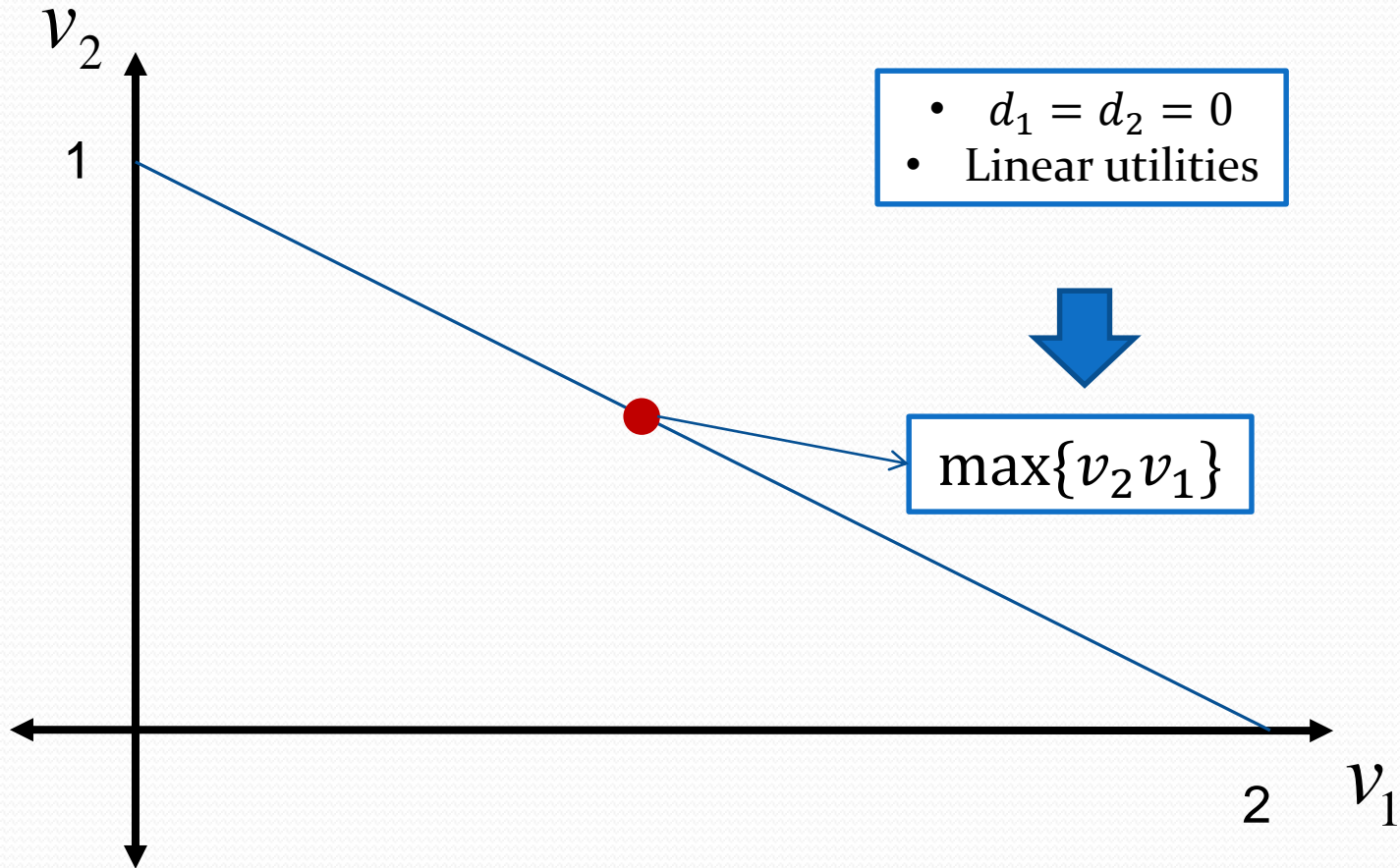
- If  $U' \subseteq U$  and  $f(U, d) \in U'$  then  $f(U', d) = f(U, d)$ .



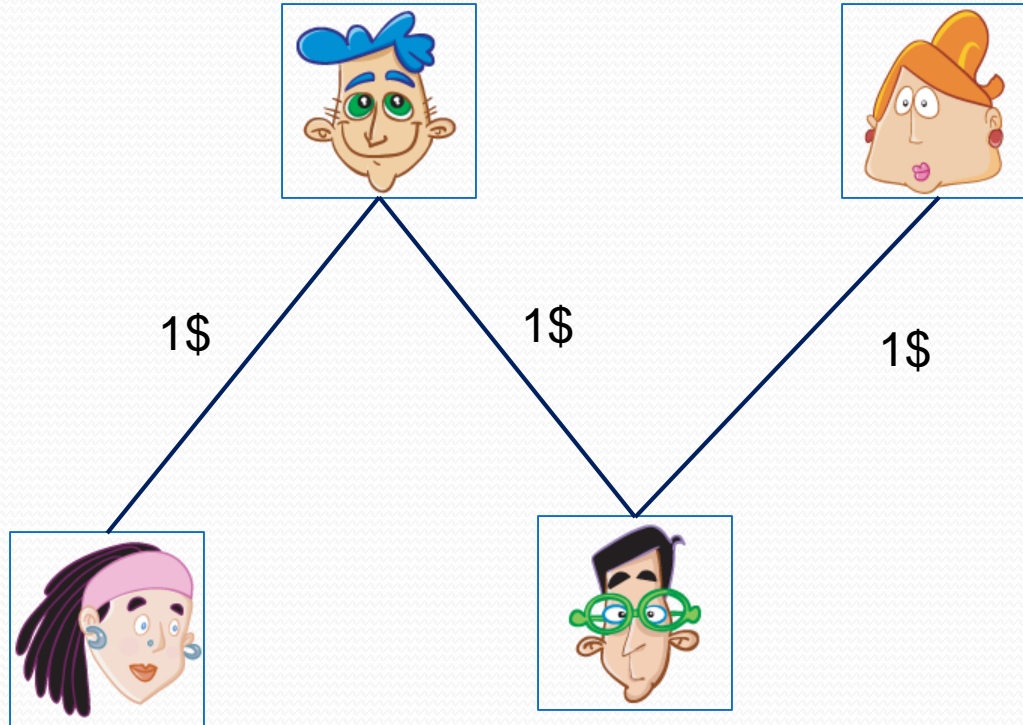
# Nash Bargaining Solution



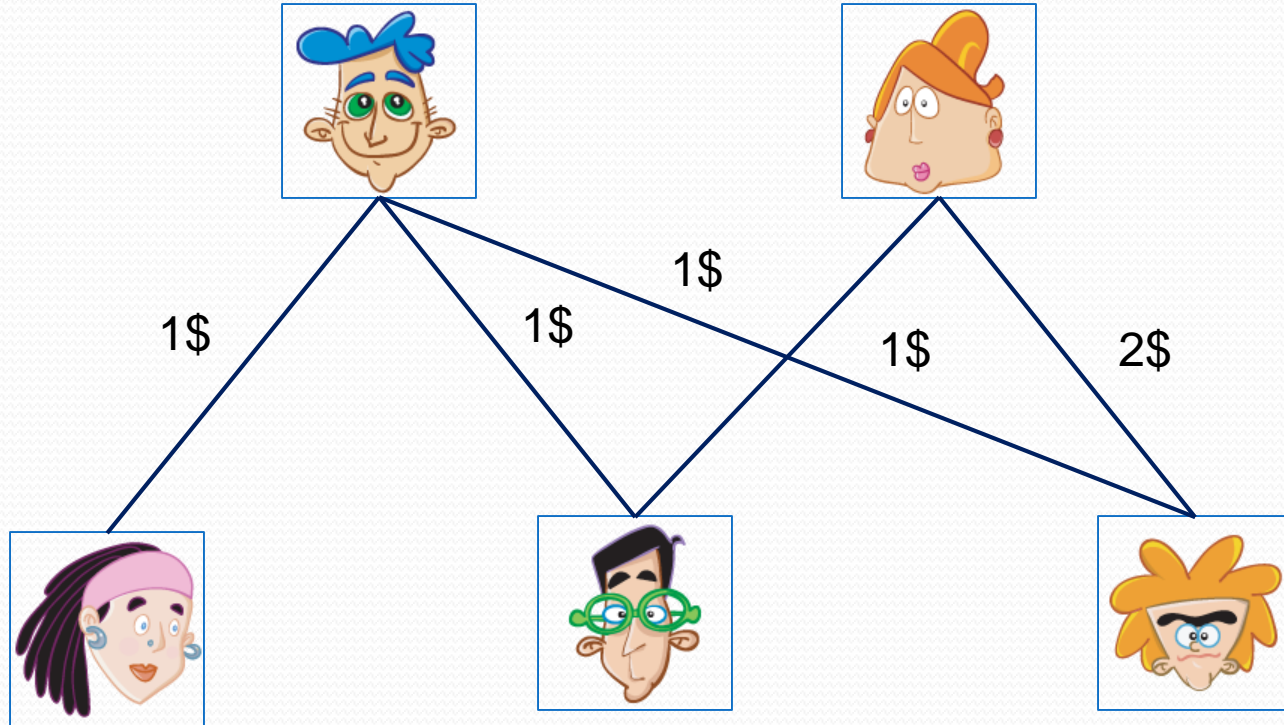
# Nash Bargaining Solution



# Bargaining Game



# Bargaining Game



# Bargaining Game

- They are  $n$  agents in the market.
- Each agent may participate in at most one contract.
- For each pair of agents  $i$  and  $j$  we are given weight  $w_{i,j}$ 
  - Representing the surplus of a contract between  $i$  and  $j$

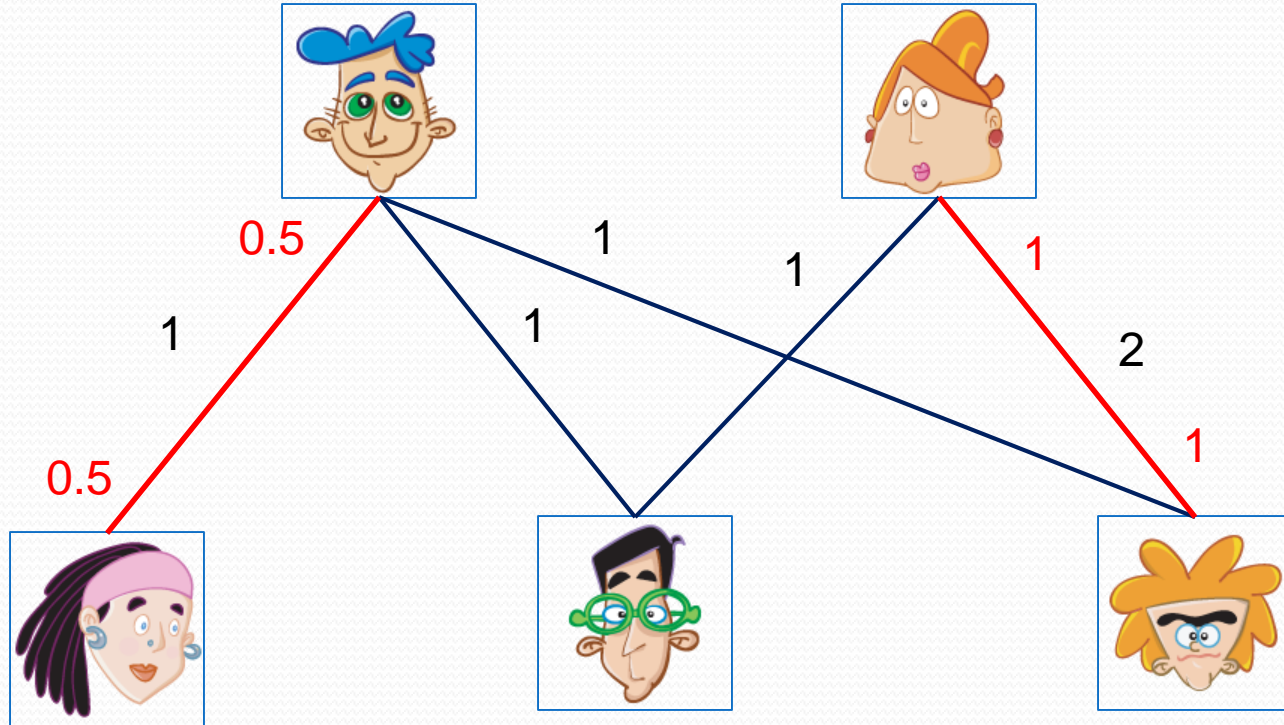
Our main task is to predict the outcome of a network bargaining game.

# Bargaining Solution

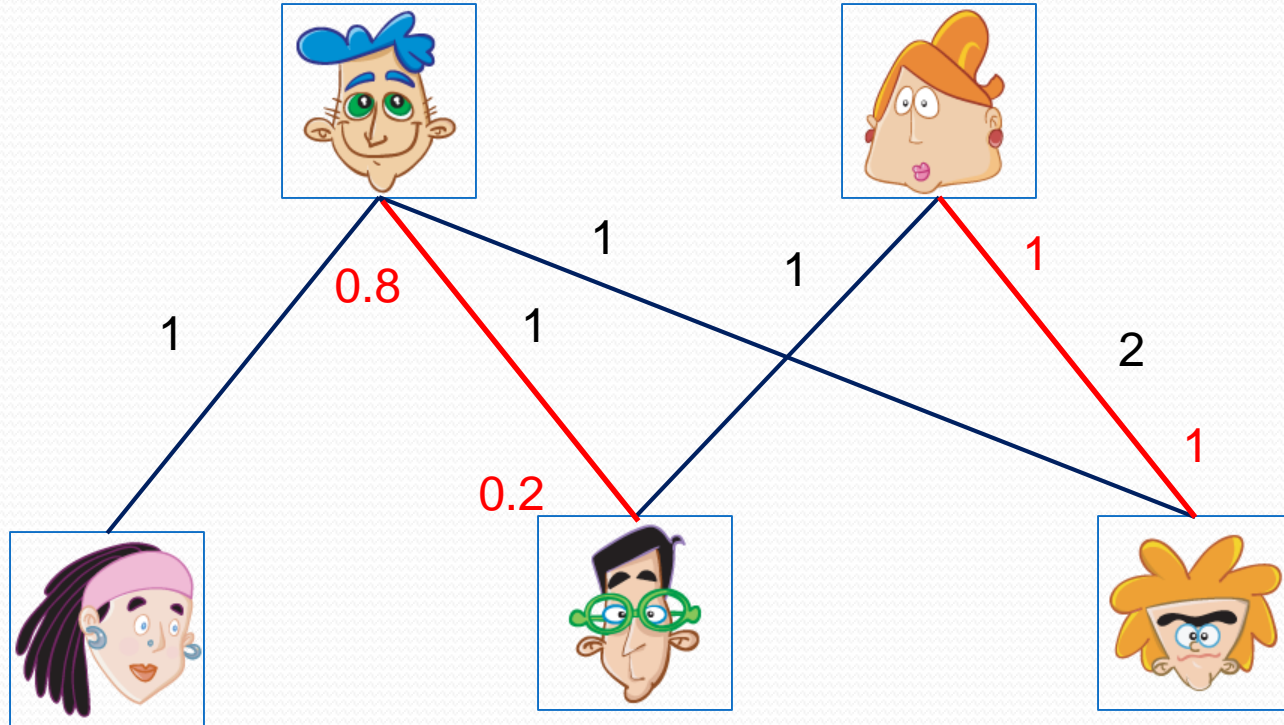
- We call a set of **contracts**  $M$  **feasible** if:
  - Each agent  $i$  is in at most 1 contract.
- A **solution**  $(\{z_{i,j}\}, M)$  of a bargaining game is:
  - A set of **feasible** contracts  $M$ .
  - For each  $(i, j)$  in  $M$ :  $z_{i,j} + z_{j,i} = w_{i,j}$
  - $z_{i,j}$  is the amount of money  $i$  earns from the contract with  $j$



# Bargaining Solution - Example



# Bargaining Solution - Example



# Bargaining Solution

- The set of **solution** is quite **large**.
- Define a **subset** of solution as a result of the **bargaining process**.



Nash bargaining solution

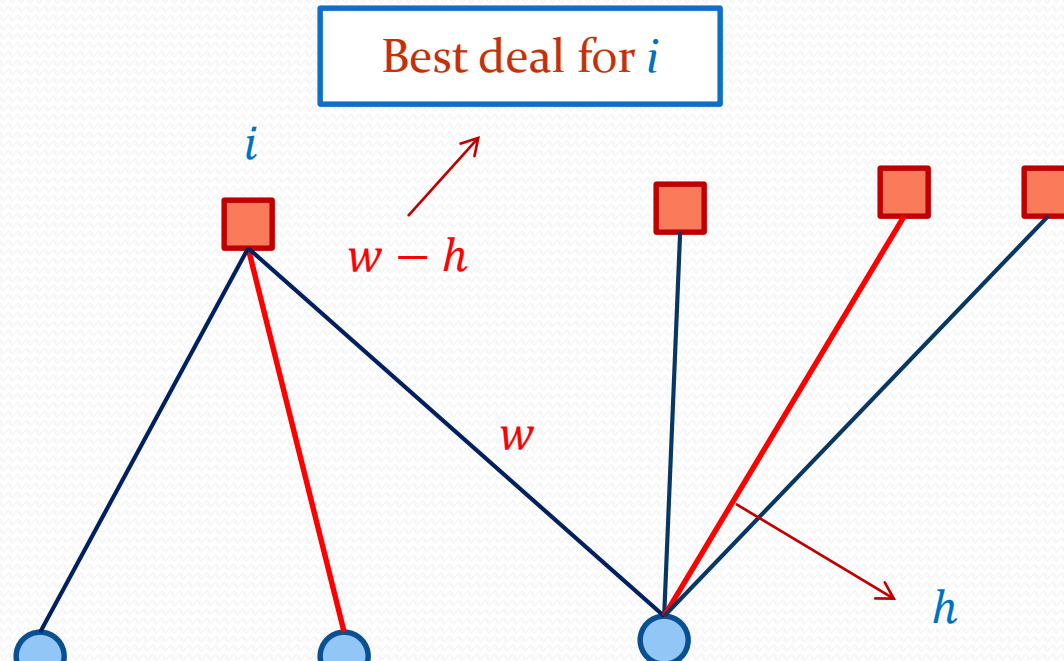
The diagram illustrates the relationship between bargaining solutions and cooperative game theory. A green-bordered box at the top contains two bullet points. Two yellow arrows point from this box to a large red oval at the bottom. Inside the oval are two red-bordered boxes: 'Nash bargaining solution' on the left and 'Cooperative game theory' on the right.

Cooperative game theory

# Goal

- Nash bargaining solution.
  - Stable
  - Balanced
- Cooperative game theory solutions.
  - Core
  - Kernel
- Connection between these two views.

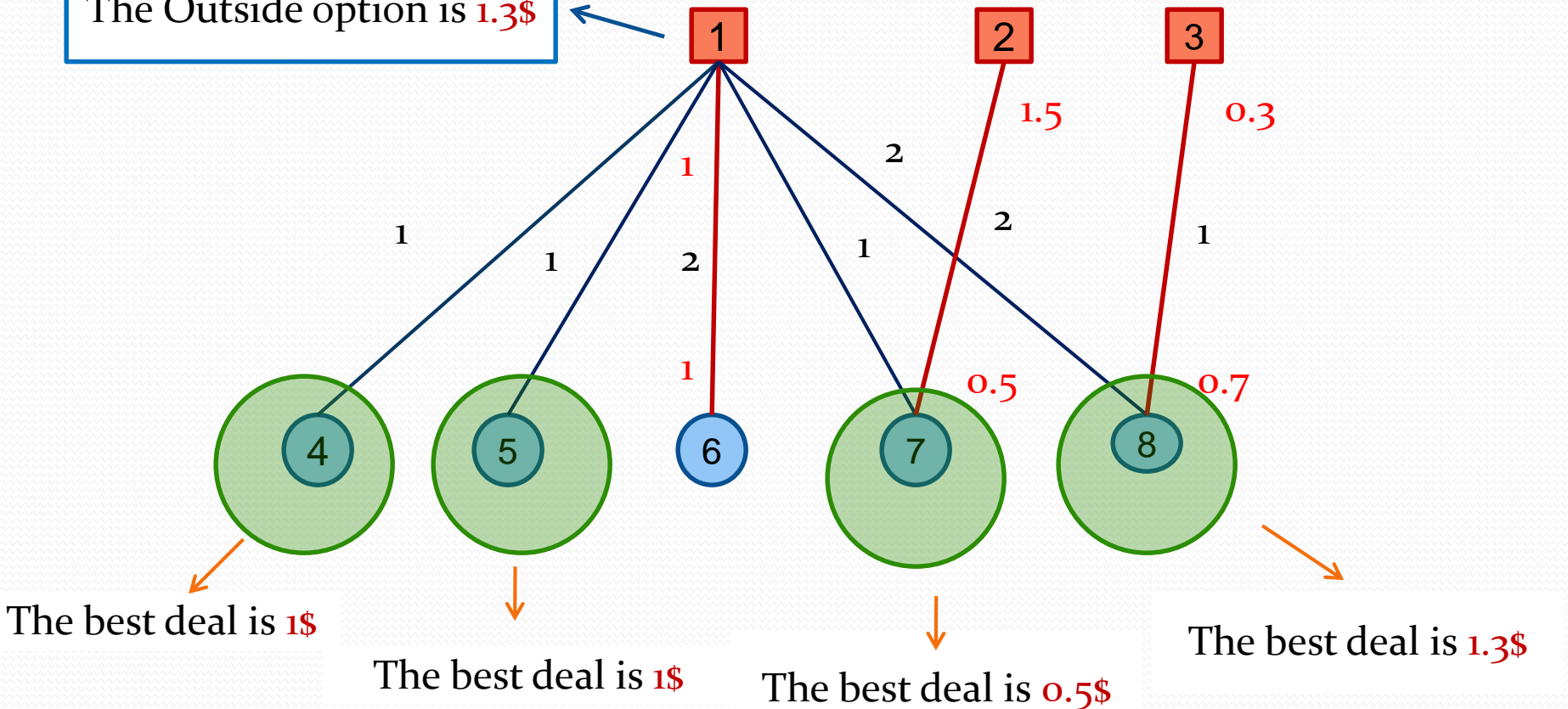
# Outside Option



- The **outside option** of an agent  $i$  is the best deal she could make with someone **outside** the contracting set  $M$ .

# Outside Option

The Outside option is 1.3\$

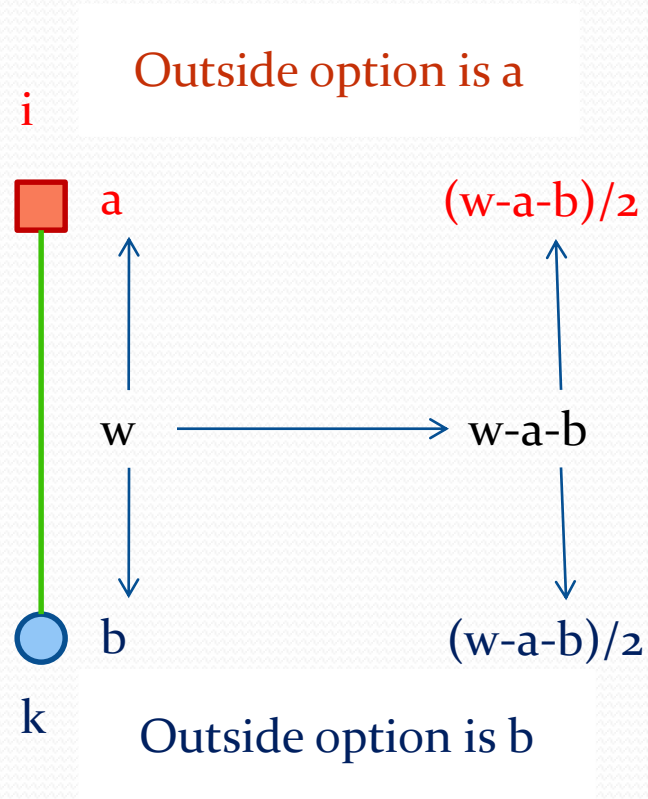




# Stable and Balanced Solutions

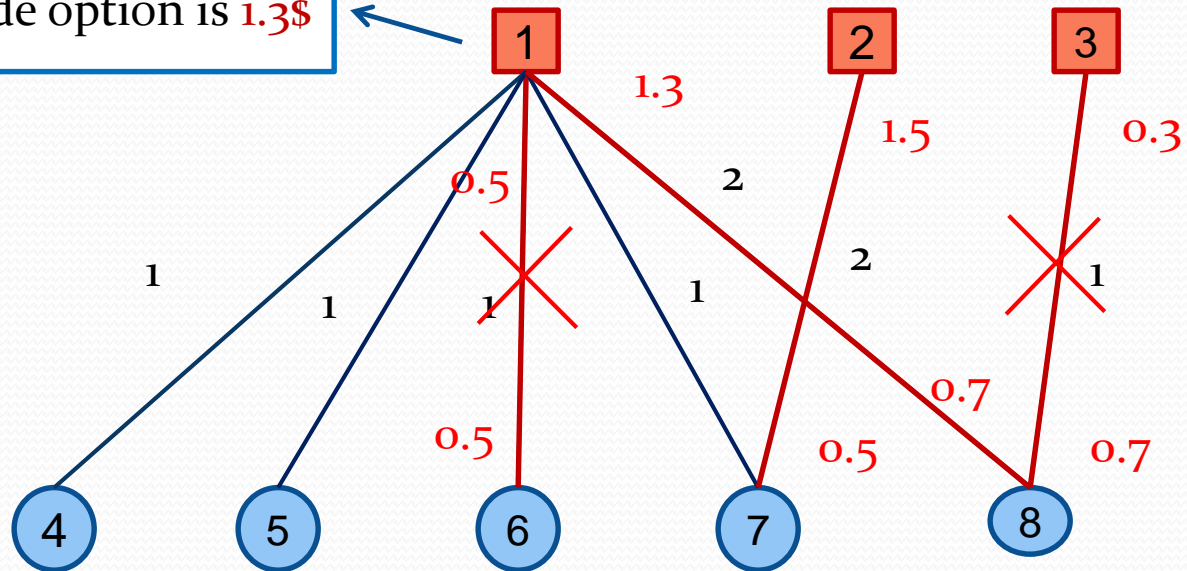
- A solution is **stable** if no agent has better outside option.
- **Nash** additionally argued that agents tend to **split surplus equally**.
- A solution is **balanced** if agents split the **net surplus equally**.
  - Each agent **gets its outside option** in a contract.
  - Then divide the **money on the table** equally.

# Balanced solution

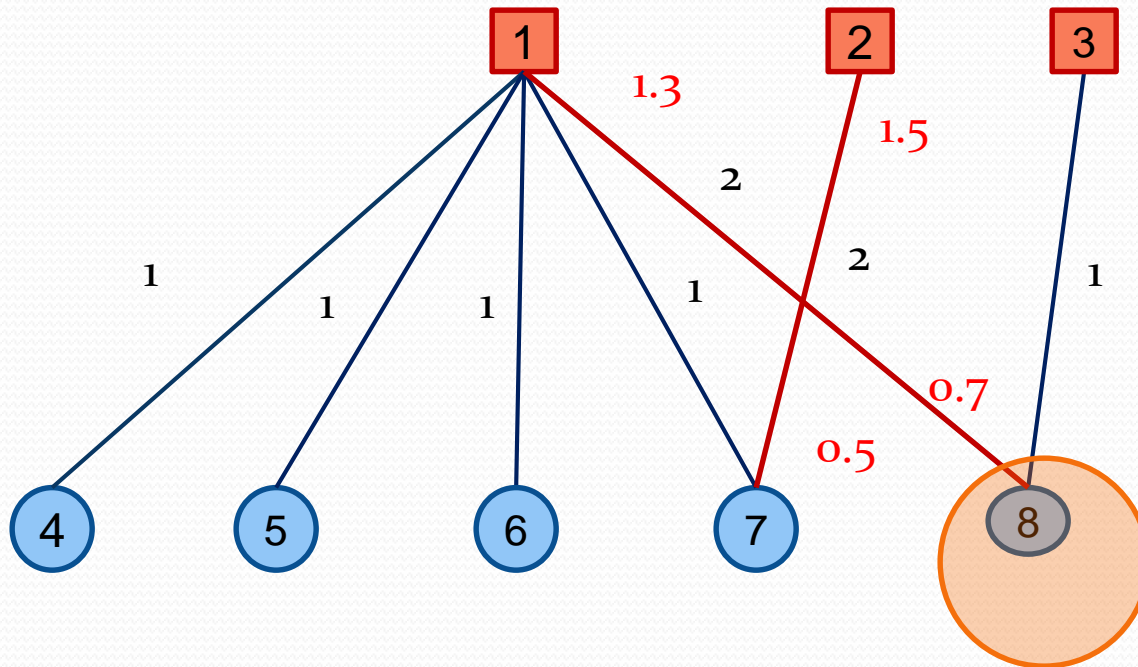


# Stable Solution

The Outside option is 1.3\$

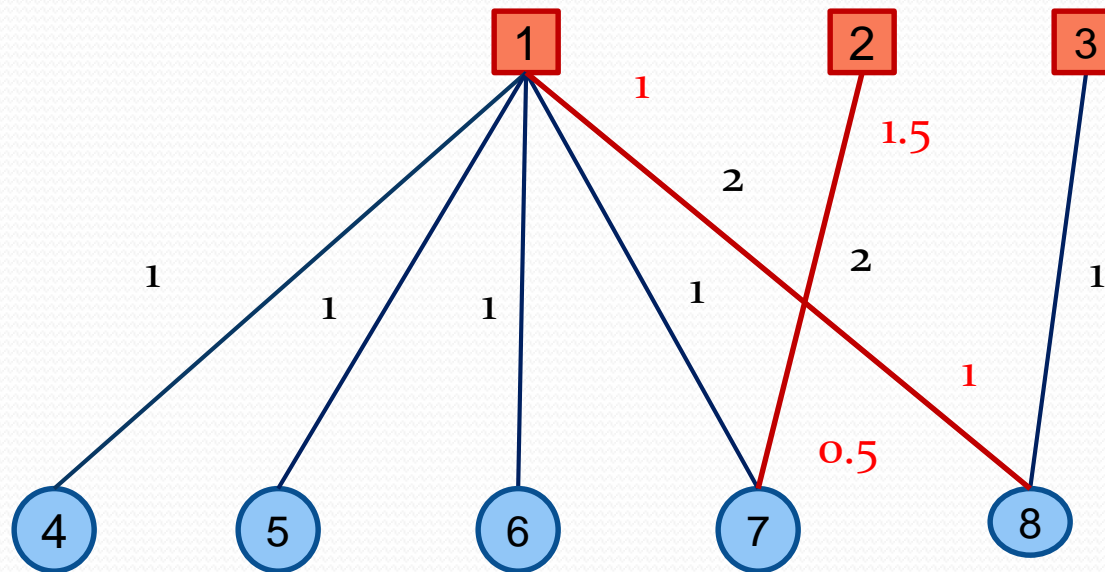


# Stable Solution



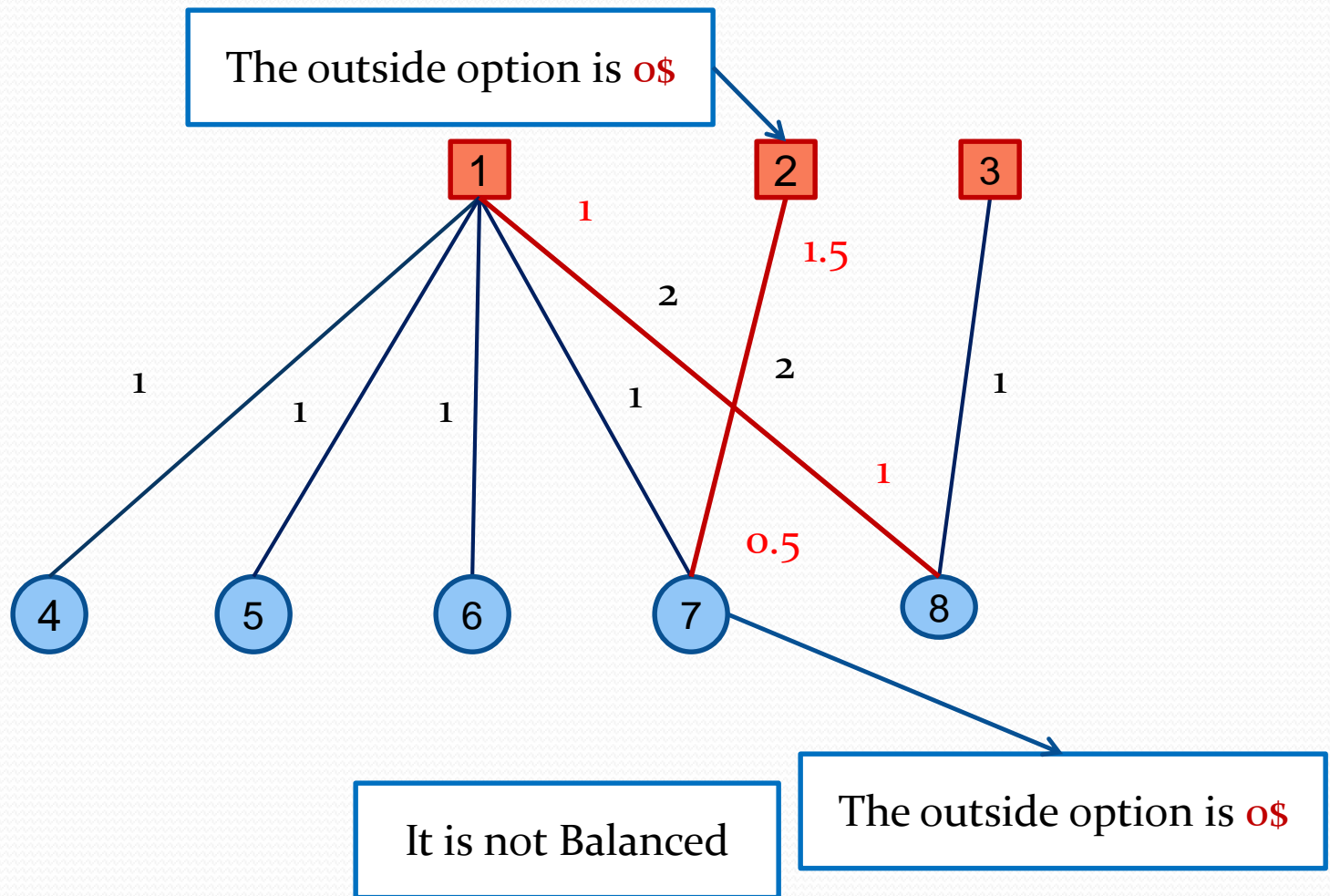
The Outside option is 1 \$

# Stable Solution



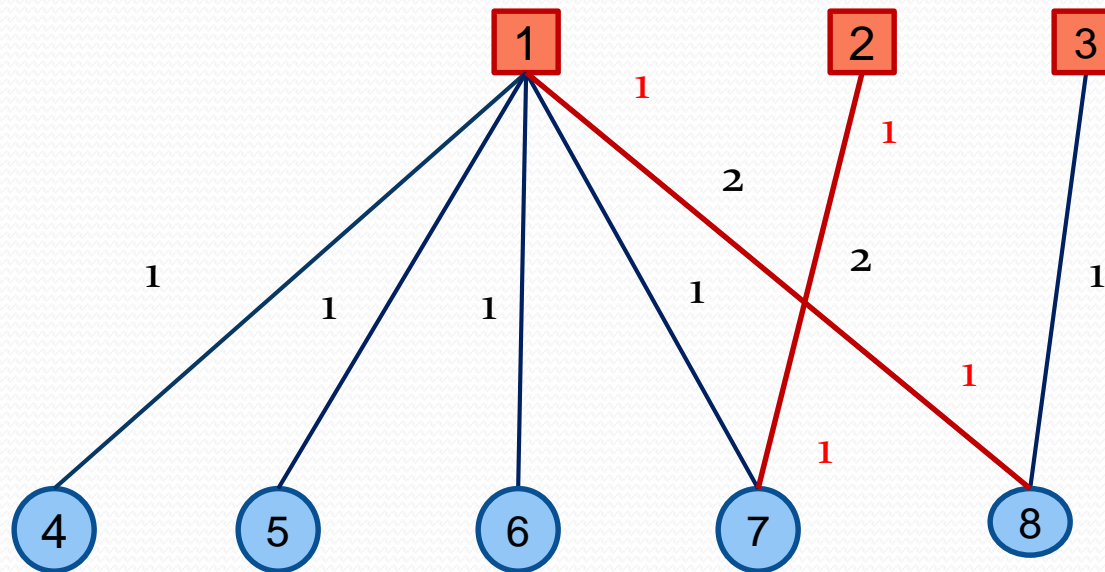
Stable Solution

# Balanced Solution





# Balanced Solution



Balanced Solution

# Cooperative game theory

- A **cooperative game** is defined by a set of agents  $N$ .
- A value function  $v: 2^N \rightarrow R^+ \cup \{0\}$ 
  - The **value** of a set of agents represents the **surplus** they can achieve.
- The **goal** is to define an **outcome** of the game  $\{x_i\}$

$v(S)$  = Maximum value of  $\sum_{(i,j) \in M} w_{i,j}$  over all feasible contract  $M$

# Core

- An outcome  $\{x_i\}$  is in the **core** if and only if:
  - Each set of agents should earn in total **at least as much** as they can achieve alone:  $\sum_{i \in S} x_i \geq v(S)$
  - Total surplus of all agents is **exactly divided** among the agents:  $\sum_{i \in N} x_i = v(N)$

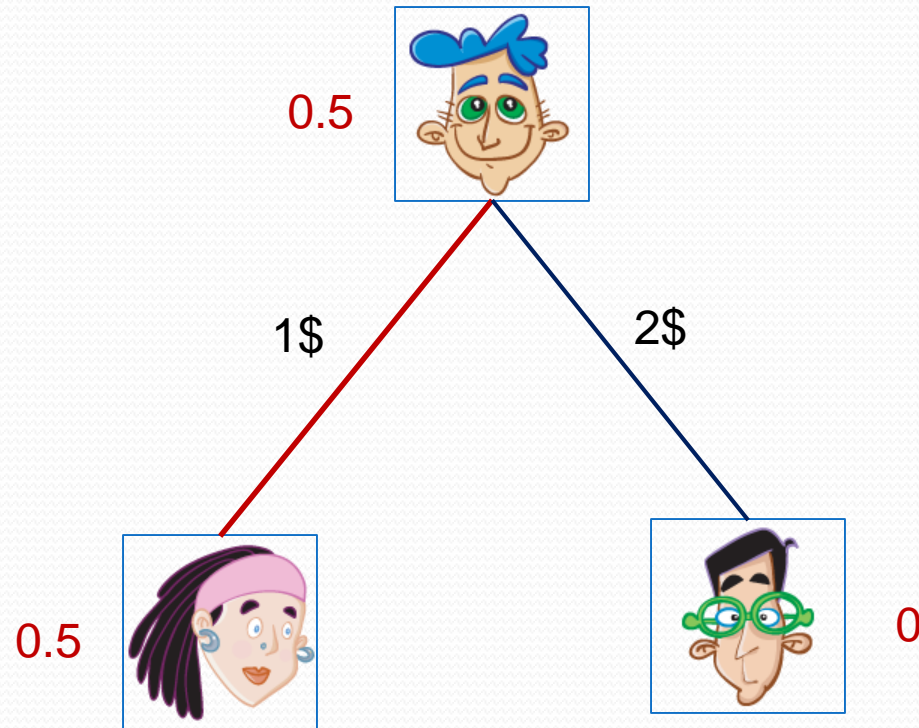
# Prekernel

- The **power** of  $i$  over  $j$  is the maximum amount  $i$  can earn without cooperation with  $j$ .

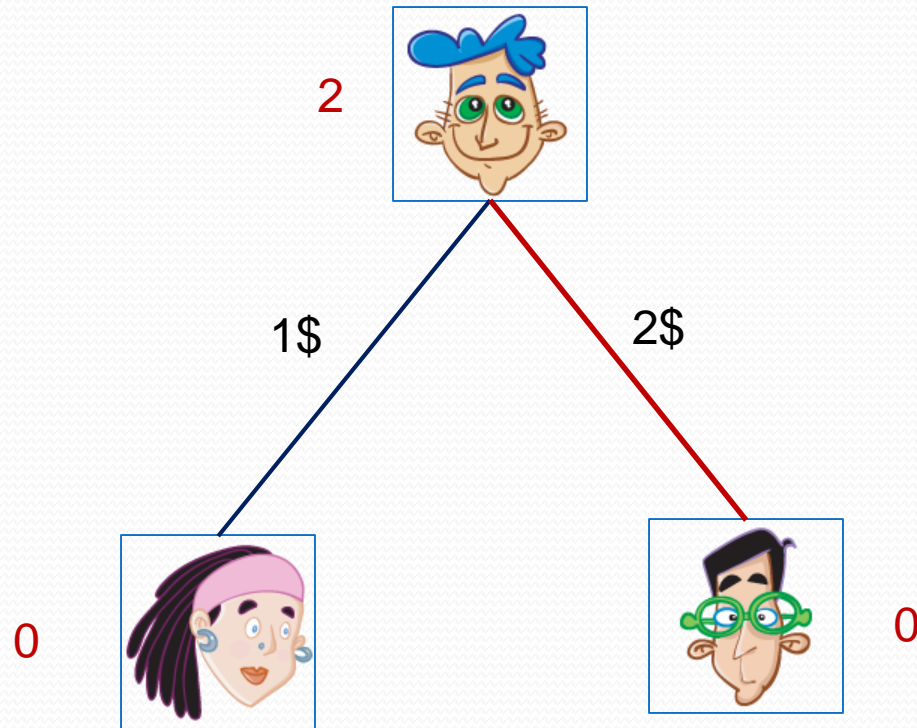
$$s_{ij}(x) = \max \left\{ \nu(S) - \sum_{k \in S} x_k : S \subseteq N, S \ni i, S \not\ni j \right\}$$

**Prekernel:** power of  $i$  over  $j$  = power of  $j$  over  $i$

# Core - example



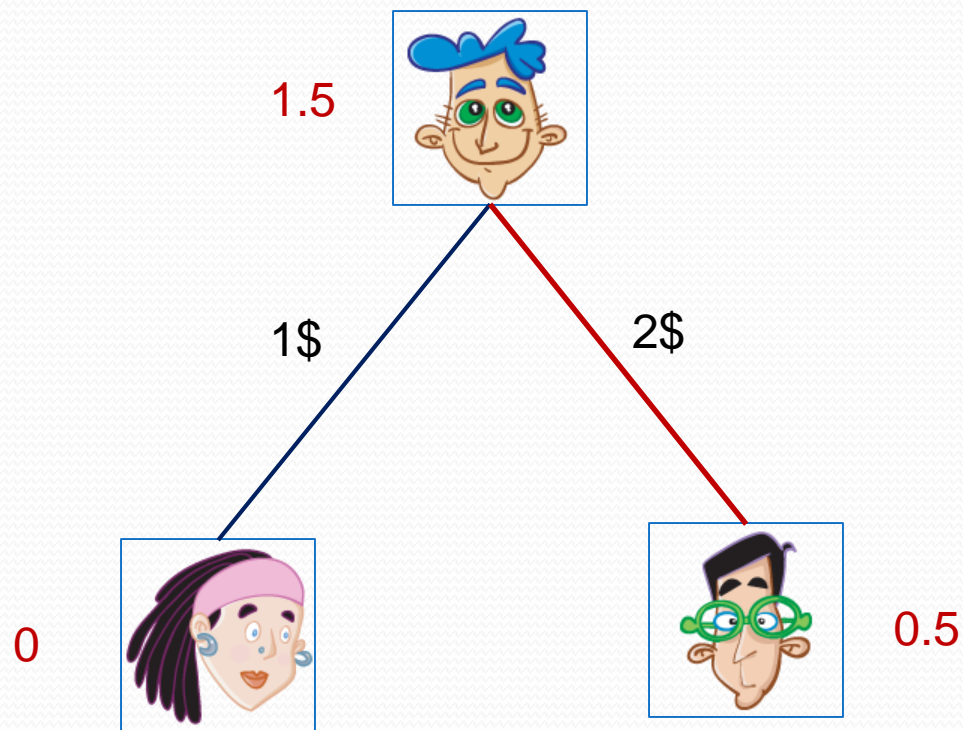
# Prekernel - example



$$s_{ij}(x) = \max \left\{ \nu(S) - \sum_{k \in S} x_k : S \subseteq N, S \ni i, S \not\ni j \right\}$$



# Prekernel - example



$$s_{ij}(x) = \max \left\{ \nu(S) - \sum_{k \in S} x_k : S \subseteq N, S \ni i, S \not\ni j \right\}$$

# Characterizing Stable Solutions

## Primal

Maximize  $\sum_{ij} w_{ij} x_{ij}$   
Subject to  $\sum_j x_{ij} \leq 1, \forall i$   
 $x_{ij} \geq 0, \forall i, j$

## Dual

Minimize  $\sum_i u_i$   
Subject to  $u_i + u_j \geq w_{ij}, \forall i, j$   
 $u_i \geq 0, \forall i$

A **stable solution**  $\approx$  a **pair of optimum** solutions of the above linear programs

# Characterizing Stable Solutions

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## Stable to LP

- given  $(\{z_{ij}\}, M)$
- $x_{ij} = 1$  iff  $(i, j) \in M$
- $u_i = z_{ij}$  iff  $(i, j) \in M$

# Characterizing Stable Solutions

## Primal

Maximize  $\sum_{ij} w_{ij} x_{ij}$   
Subject to  $\sum_j x_{ij} \leq 1, \forall i$   
 $x_{ij} \geq 0, \forall i, j$

## Dual

Minimize  $\sum_i u_i$   
Subject to  $u_i + u_j \geq w_{ij}, \forall i, j$   
 $u_i \geq 0, \forall i$

## LP to Stable

- given  $(\{x_{ij}\}, \{u_i\})$
- $(i, j) \in M$  iff  $x_{ij} = 1$
- $z_{ij} = u_i$  for all  $x_{ij} = 1$

# Core = Stable

## Stable $\subseteq$ Core

- We use the **characterization** of stable solutions
- Consider  $(\{x_{ij}\}, \{u_i\})$
- Define  $x_i = u_i$
- We should prove:
  - $\sum_{i \in N} x_i = v(N)$
  - $\sum_{i \in R} x_i \geq v(R)$

# Core = Stable

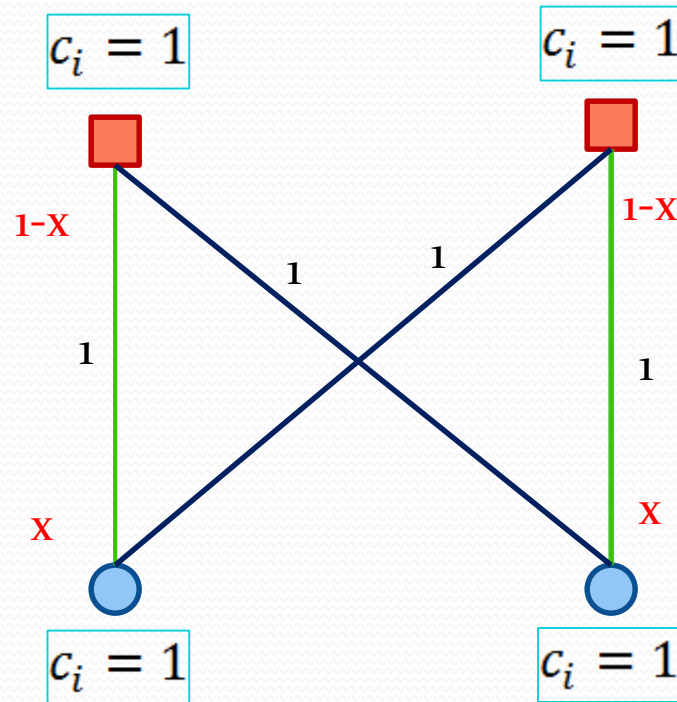
## Core $\subseteq$ Stable

- Assume  $(\{x_i\})$  is in the core.
- Consider an optimal set of contracts  $M$
- Set  $z_{ij} = x_i$  and  $z_{ji} = x_j$  for all  $(i, j) \in M$ 
  - $\sum_i x_i = v(N) = \text{maximum matching}$
- Set  $u_i = x_i$ 
  - $(\{u_i\})$  is a **feasible solution** for the dual.

# Core $\cap$ Kernel = Balanced

- Assume  $(\{x_i\})$  is in the **core  $\cap$  kernel**.
- Construct  $(\{z_{ij}\}, M)$  based on the **previous approach**.
- Define  $\hat{s}_{ij} = \alpha_i - z_{ij}$
- Prove  $s_{ij} = \hat{s}_{ij}$

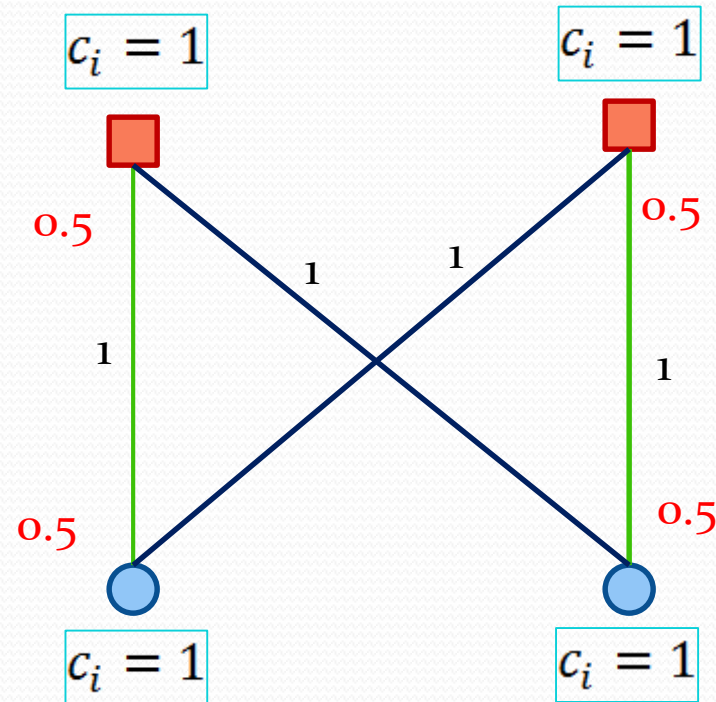
# Stable, Balanced are too large



Stable and Balanced Solution



# Unique outcome



The symmetric solution

# Unique outcome, Nucleolus

- The **excess** of a set  $S$  is the extra earning of  $S$  in  $\{x_i\}$ .
  - $\epsilon(S) = \sum_{i \in S} x_i - \nu(S)$
- Let  $\epsilon = (\epsilon_{S_1}, \dots, \epsilon_{S_{2N}})$  be the vector of excesses sorted in non-decreasing order.
- - The nucleolus is **unique**.
  - It is **in the kernel**.
  - It is **in the core** if core is non-empty.
  - Characterized by a set of simple, reasonable **axiom**.
    - **Symmetry**