

# Extensive Form Games

## Game Theoretic Analysis

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UNIVERSITY  
OF ALBERTA



## Recap: Best Response & Nash Equilibrium

### Definition

The set of  $i$ 's best responses to a strategy profile  $s_{-i} \in S_{-i}$  is

$$BR_i(s_{-i}) = \{a_i^* \in A_i \mid u_i(a_i^*, s_{-i}) \geq u_i(a_i, s_{-i}) \quad \forall a_i \in A_i\}$$

### Definition

A strategy profile  $s$  is a **Nash equilibrium** iff

$$\forall i \in N, s'_i \in S_i : u_i(s) \geq u_i(s'_i, s_{-i})$$

Equivalently,

$$\forall i \in N, a_i \in A_i : s_i(a_i) > 0 \iff a_i \in BR_i(s_{-i}).$$

When at least one  $s_i$  is mixed,  $s$  is a **mixed strategy Nash equilibrium**

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## Recap: Rationalizability

A rationalizable strategy is one which is a best response to some belief about the other agents

- that also assumes opponent is playing some rationalizable strategy
- the beliefs need not be consistent with each other

In two-player games, rationalizable strategies are exactly those that survive **iterated removal of strictly dominated strategies**.

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### Example: Traveller's Dilemma

- 300 is **weakly dominated** by 299
- But it is **strictly dominated** by a mixed strategy over the actions 180–299.
- So 300 does not survive iterated removal of strictly dominated strategies
- In the game with 300 removed, 299 is weakly dominated by 298
- ...but **strictly dominated** by a mixed strategy over 180–298

# Lecture Overview

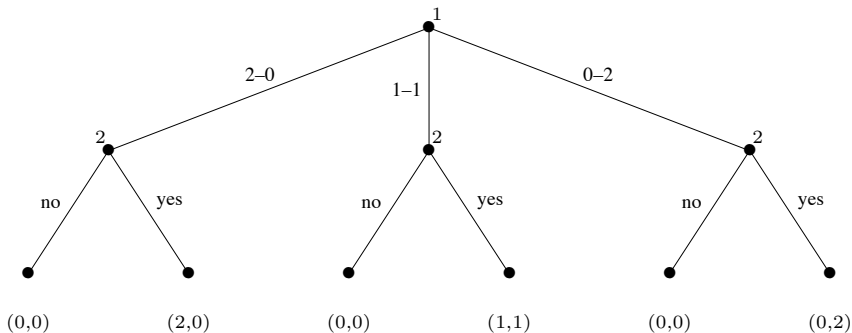
## Extensive Form Games

Nash equilibrium

Subgame Perfect Equilibrium

# Extensive Form Games

- Normal form games don't have any notion of *sequence*: all actions happen **simultaneously**
- The **extensive form** is a game representation that explicitly includes temporal structure (i.e., a game tree)



# Perfect Information

There are two kinds of extensive form game:

1. **Perfect information:** Every agent **sees all actions** of the other players (including any special “Chance” player)
  - e.g., Chess, Checkers, Backgammon, Pandemic
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# Perfect Information

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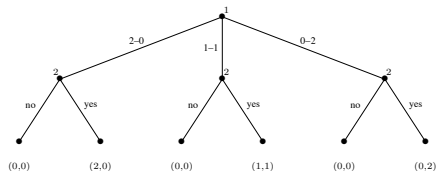
1. **Perfect information:** Every agent **sees all actions** of the other players (including any special “Chance” player)
  - e.g., Chess, Checkers, Backgammon, Pandemic
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2. **Imperfect information:** Some actions are **hidden**
  - Players may not know exactly where they are in the tree
  - Different players may have different knowledge (about where they are in the tree)
  - E.g., Poker, Rummy, Scrabble

# Perfect Information Extensive Form Game

## Definition

A **finite perfect information game in extensive form** is a tuple  $G = (N, A, H, Z, \chi, \rho, \sigma, u)$ , where

- $N$  is a set of  $n$  **players**
- $A$  is a single set of **actions**

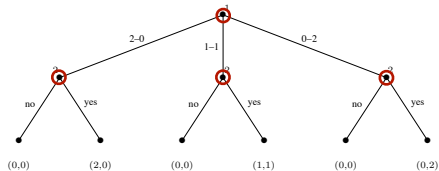


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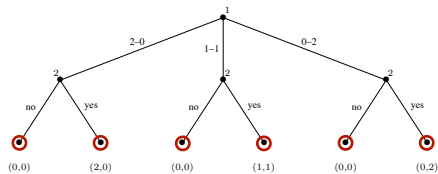


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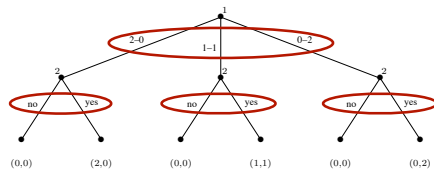


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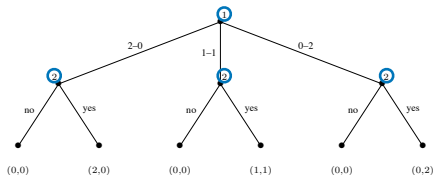


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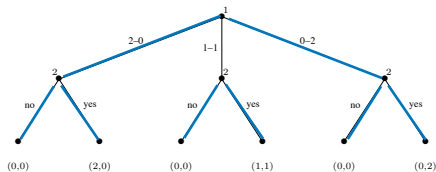


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- $\sigma : H \times A \rightarrow H \cup Z$  is the **successor function**

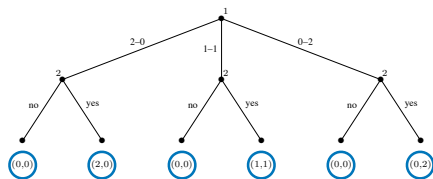


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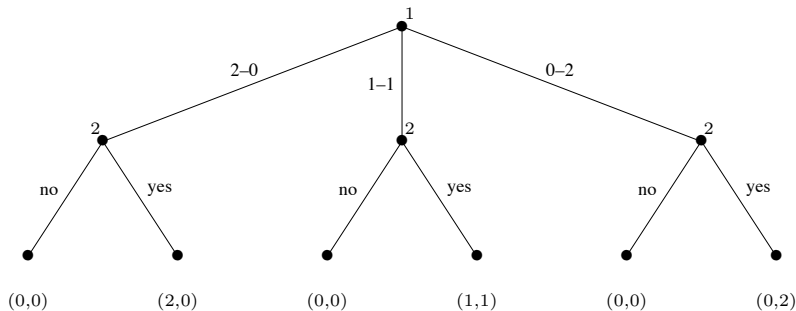
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- $\sigma : H \times A \rightarrow H \cup Z$  is the successor function
- $u = (u_1, \dots, u_n)$  is a profile of **utility functions**  
 $u_i : Z \rightarrow \mathbb{R}$  for each player  $i$



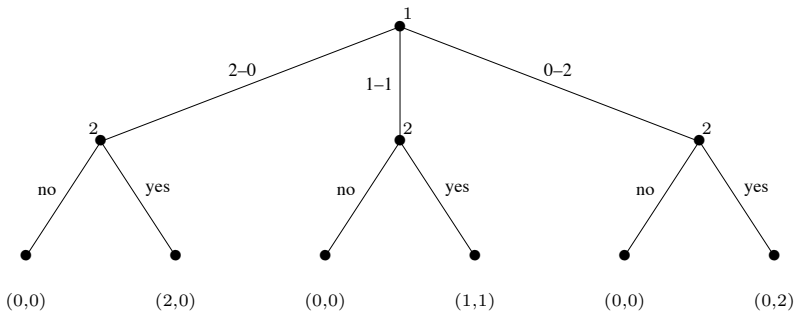


# Fun Game: The Sharing Game



- Two siblings must decide how to share two \$100 coins
- Sibling 1 suggests a division, then sibling 2 accepts or rejects
  - If rejected, nobody gets any coins
- Play against 2 other people, once per person, different role each time

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- Two siblings must decide how to share two \$100 coins
- Sibling 1 suggests a division, then sibling 2 accepts or rejects
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- Play against 2 other people, once per person, different role each time
- **Question:** Did you have a plan for every possible eventuality?

# Lecture Overview

Extensive Form Games

**Nash equilibrium**

Subgame Perfect Equilibrium

# Pure Strategies

## Question

What are the **pure strategies** in an extensive form game?

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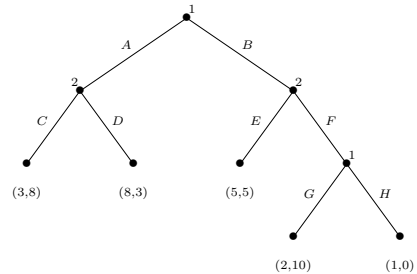
Let  $G = (N, A, H, Z, \chi, \rho, \sigma, u)$  be a perfect information game in extensive form. Then the **pure strategies** for player  $i$  consist of the cross product of actions available to  $i$  at each of their choice nodes:

$$\prod_{h \in H | \rho(h) = o} \chi(h).$$

Note that a pure strategy associates an action with **every** choice node, even those that will **never be reached**.

# Pure Strategies Example

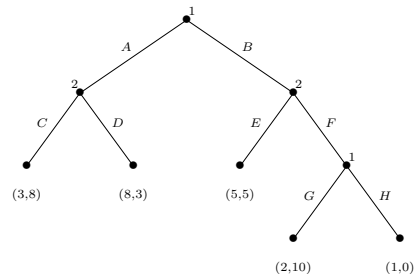
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$$\{(C, E), (C, F), (D, E), (D, F)\}$$

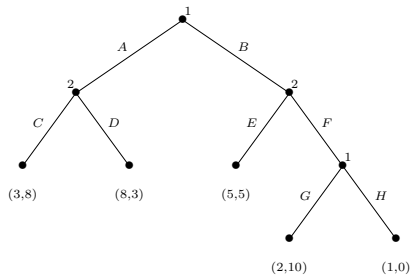


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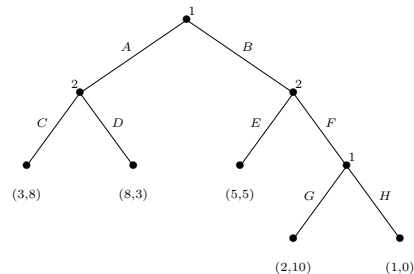
# Pure Strategies Example

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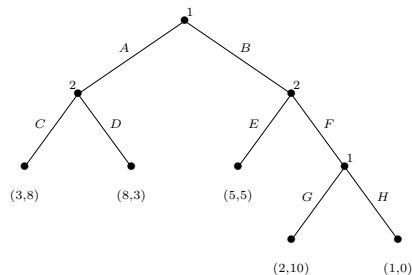
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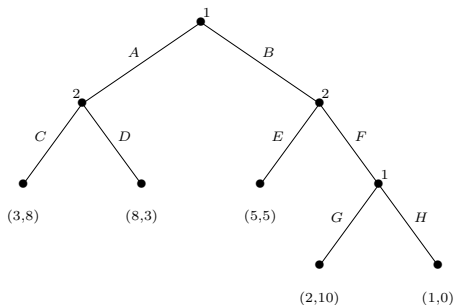
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Note that there is always an action for the second node, even when it cannot be reached.

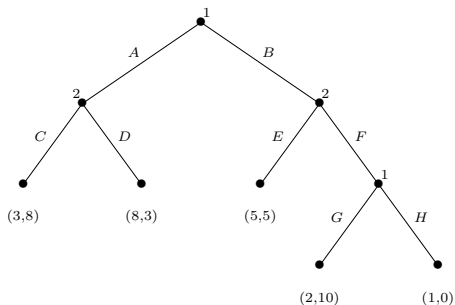
## Induced Normal Form

- Any pair of pure strategies uniquely identifies a **terminal node**, which identifies a **utility** for each agent (**why?**)



## Induced Normal Form

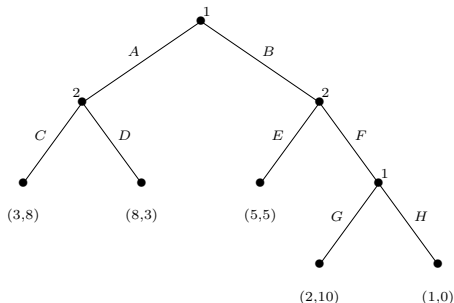
- Any pair of pure strategies uniquely identifies a **terminal node**, which identifies a **utility** for each agent (**why?**)
- We have now defined a set of **agents**, **pure strategies**, and **utility functions**
- Any perfect-information extensive form game defines a corresponding **induced normal form game**



	$C, E$	$C, F$	$D, E$	$D, F$
$A, G$	3,8	3,8	8,3	8,3
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- Question:** Which representation is more **compact**?



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## Reusing Old Definitions

We can also plug our new definition of **pure strategy** into our existing definitions for:

- Mixed strategy
- Best response
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What is the definition of a **mixed strategy** in an extensive form game?

## Pure Strategy Nash Equilibria

### Theorem [Zermelo, 1913]

Every finite perfect-information game in extensive form has at least one **pure strategy Nash equilibrium**.



# Pure Strategy Nash Equilibria

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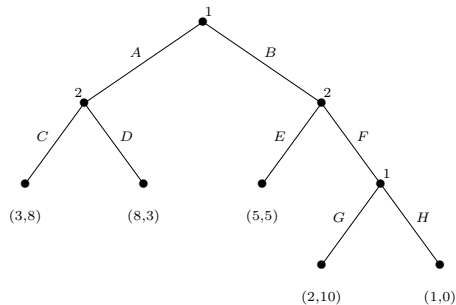
Every finite perfect-information game in extensive form has at least one **pure strategy Nash equilibrium**.

*Proof:* Solve by **backward induction**

- Starting from the bottom of the tree, no agent needs to randomize, because there is a deterministic best response.
- Replace those nodes with the resulting utility vector
- Repeat until an action is assigned for all choice nodes

(There might be multiple pure strategy Nash equilibria in cases where an agent has multiple best responses at a single choice node.)

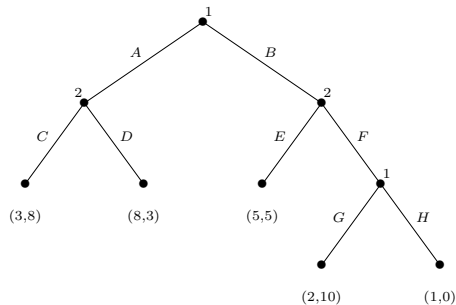
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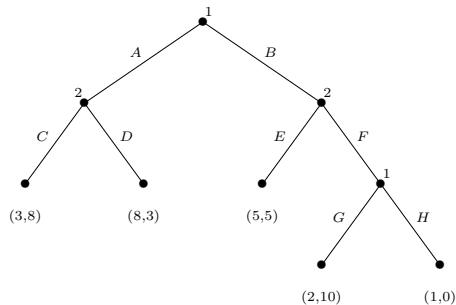
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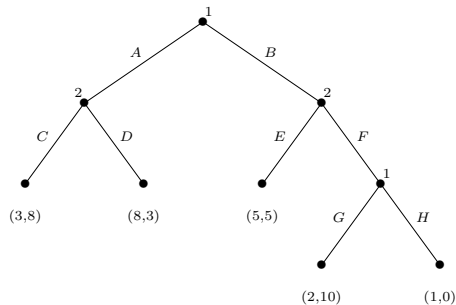


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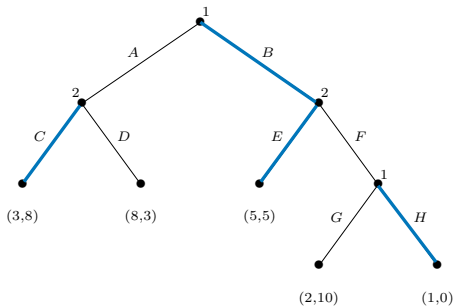
Nash equilibrium

**Subgame Perfect Equilibrium**

## Subgame Perfection, informally

Some equilibria seem **less plausible** than others.

- $\langle (B, H), (C, E) \rangle$ :  $F$  has payoff 0 for player 2, because player 1 plays  $H$ , so player 2's best response is to play  $E$
- But why would player 1 play  $H$  if they got to that choice node?
- The equilibrium relies on a “threat” from player 1 that is not **credible**.
- **Subgame perfect equilibria** are Nash equilibria that do not rely on non-credible threats.



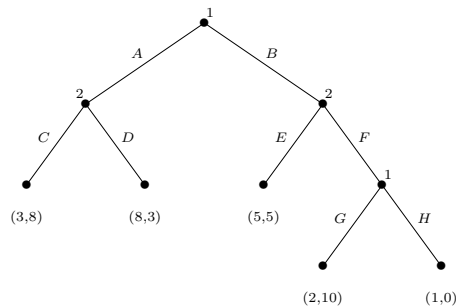
# Subgames

## Definition

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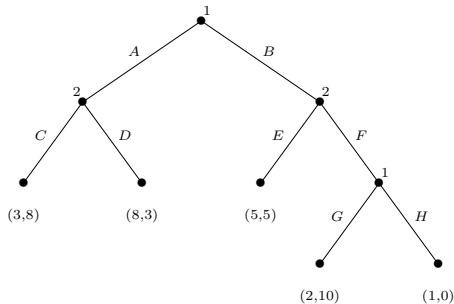
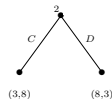
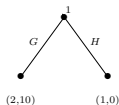
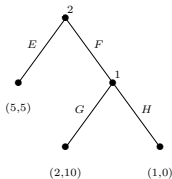
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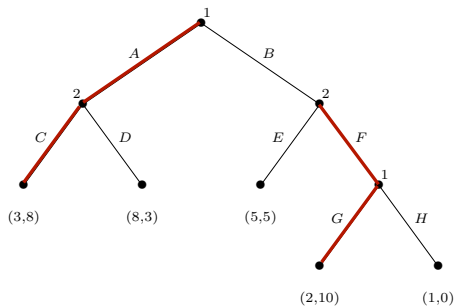
## Examples:



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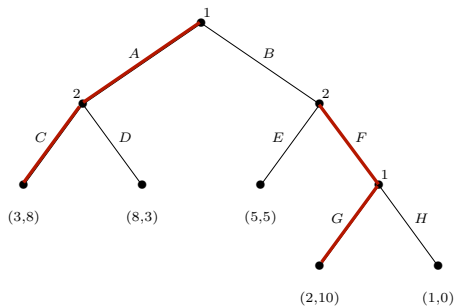


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Any equilibrium computed by backward induction will be subgame perfect (**Why?**)

# Summary

- **Extensive form games** allow us to represent sequential action
  - Perfect information: when we see everything that happens
  - Imperfect information: different agents have different information
- Pure strategies for extensive form games map choice nodes to actions
  - Induced normal form is the normal form game with these pure strategies
  - Notions of mixed strategy, best response, etc. translate directly
- Subgame perfect equilibria are those which do not rely on non-credible threats
  - Can always find a subgame perfect equilibrium using backward induction
  - Furthermore, this equilibrium is guaranteed to be in pure strategies