
Game Theory (CS4187)

Lectures 21, 22, and 23

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Instructor: Gourav Saha

Games with Incomplete Information: Example

Student 1: Dedicated
Student 2: Dedicated

		Student 2	
		Work	Chill
Student 1	Work	5, 5	3, 3
	Chill	3, 3	1, 1

Student 1: Chiller party
Student 2: Chiller party

		Student 2	
		Work	Chill
Student 1	Work	3, 3	1, 5
	Chill	5, 1	3, 3

Student 1: Dedicated
Student 2: Chiller party
(or vice-versa in which
case the number in the
payoff matrix flips)

		Student 2	
		Work	Chill
Student 1	Work	5, 3	3, 5
	Chill	3, 1	1, 3

- Consider the game of extra assignment that we discussed during lecture 1 and again mentioned briefly while discussing SFGs.
- Let's consider a variant of this game where students 1 and 2 can be either dedicated or "chiller party". Each student don't know whether he/she is dedicated or not but does not know what kind of student the other student is.

Bayesian Games

- Bayesian Games is **one of the models** of incomplete information games.
 - Players are characterized by their types.
 - Type of a player determines its payoff.
 - The types of the players are sampled from a joint probability distribution. This joint distribution is also called the **common prior distribution**.
 - The common prior distribution is a **common knowledge**.
 - We assume that nature samples types of all the players from this common prior.
 - The **nature tells individual player its type**, but **does not tell the types of other players**.
 - This ensures that players don't know each other's payoff matrix.
 - But has some idea of the payoff matrix of the other players.

Mention that this is just a model. There is nothing like nature actually telling player anything.

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 - This ensures that players don't know each other's payoff matrix.
 - But has some idea of the payoff matrix of the other players.
- Bayesian Games was proposed by **John Harsanyi** (won Nobel prize along with John Nash; same year).
- We will be first taking about **Simultaneous move** Bayesian games.

Bayesian Games: Definition

Definition (Simultaneous Move Bayesian Games): A strategic form game (SFG) Γ is a tuple, $\langle N, (S_i)_{i \in N}, (\Theta_i)_{i \in N}, P, (u_i)_{i \in N} \rangle$ where,

1. $N = \{1, 2, \dots, n\}$ is the **set of players**.
2. S_i is the **set of actions** of the i^{th} player. The action of the i^{th} player, denoted by s_i belongs to set S_i , i.e. $s_i \in S_i$.
3. Θ_i is the **set of types** of the i^{th} player. The type of the i^{th} player, denoted by θ_i belongs to set Θ_i , i.e. $\theta_i \in \Theta_i$. We have, $\Theta = \Theta_1 \times \Theta_2 \times \dots \times \Theta_n$. We have $\theta = (\theta_1, \theta_2, \dots, \theta_n)$ be the type of all the players. Also, $\theta = (\theta_i, \theta_{-i})$.
4. $P: \Theta_1 \times \Theta_2 \times \dots \times \Theta_n \rightarrow \mathbb{R}$ is the common prior.
5. $u_i: \Theta_1 \times \Theta_2 \times \dots \times \Theta_n \times S_1 \times S_2 \times \dots \times S_n \rightarrow \mathbb{R}$ is the utility function of the i^{th} player. To elaborate, the payoff the i^{th} player is $u_i(\theta_1, \theta_2, \dots, \theta_n, s_1, s_2, \dots, s_n)$.

Bayesian Games: Strategy

- So in Bayesian games, **a player knows its type** but it **may or may not** know types of the other players.
- Since a player knows its type, it is only logical that the **player uses its type while deciding its strategy**. As before, there are two kind of strategies:

- **Pure strategy:** Pure strategy of player i mapping from the set of types of player i , Θ_i , to the set of pure strategies of player i , S_i . Mathematically,

$$s_i : \Theta_i \rightarrow S_i$$

Let $s_i(\theta_i)$ denote the pure strategy of player i when its type is θ_i .

- **Mixed strategy:** Mixed strategy of player i mapping from the set of types of player i , Θ_i , to the set of pure strategies of player i , $\Delta(S_i)$. Mathematically,

$$\sigma_i : \Theta_i \rightarrow \Delta(S_i)$$

Let $\sigma_i(\theta_i, s_i)$ denote the probability that player i plays pure strategy s_i if its type is θ_i .

Let $\sigma_i(\theta_i)$ denote the mixed strategy of player i when its type is θ_i . **$\sigma_i(\theta_i)$ is a vector** whose elements are $\sigma_i(\theta_i, s_i)$.

Bayesian Games: Utility function

- We now discuss utility function of a player in a Bayesian game separately for pure strategy and mixed strategy.

PURE STRATEGY

- Let $U_i(\theta, s)$ denote the utility of player i if the type of the players is θ and strategy profile is $s = (s_i, s_{-i})$.
 - For all $i \in N$, $s_i = (s_i(\theta_{i,1}), s_i(\theta_{i,2}), \dots, s_i(\theta_{i,|\Theta_i|}))$ where $\theta_{i,j}$, $j = 1, 2, \dots, |\Theta_i|$, is the j^{th} type of player i (this highlighted component is salient to incomplete information games because strategy of a player is complete plan of what it will do if it's type is so and so.).

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PURE STRATEGY

- Let $U_i(\theta, s)$ denote the utility of player i if the type of the players is θ and strategy profile is $s = (s_i, s_{-i})$.
- Now player i knows it's type, θ_i . But it does not know the type of other players, θ_{-i} . Hence, **for player i , θ_{-i} is a random variable** and consequently the function $U_i(\theta, s) = U_i(\theta_i, \theta_{-i}, s)$ is **function of random variable θ_{-i}** . But player i can find the expected value of $U_i(\theta, s)$ conditioned on it's type being θ_i ; this is exactly the utility function of player i . Mathematically, **the utility of player i is**,

$$U_i(s_i, s_{-i} | \theta_i) = E[U_i(\theta, s) | \theta_i] \quad (1)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} E[U_i(\theta, s) | \theta_i, \theta_{-i}] P[\theta_{-i} | \theta_i] \quad (2)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i} | \theta_i] u_i(\theta_i, \theta_{-i}, s_i(\theta_i), s_{-i}(\theta_{-i})) \quad (3)$$

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$$= \sum_{\theta_{-i} \in \Theta_{-i}} E[U_i(\theta, s) | \theta_i, \theta_{-i}] P[\theta_{-i} | \theta_i] \quad (2)$$

θ_i fixed because it is known to a player i .

$$= \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i} | \theta_i] u_i(\theta_i, \theta_{-i}, s_i(\theta_i), s_{-i}(\theta_{-i})) \quad (3)$$

Bayesian Games: Utility function

- We now discuss utility function of a player in a Bayesian game separately for pure strategy and mixed strategy.

MIXED STRATEGY

- Let $U_i(\theta, \sigma)$ denote the utility of player i if the type of the players is θ and strategy profile is $\sigma = (\sigma_i, \sigma_{-i})$.
 - For all $i \in N$, $\sigma_i = (\sigma_i(\theta_{i,1}), \sigma_i(\theta_{i,2}), \dots, \sigma_i(\theta_{i,|\Theta_i|}))$ where $\theta_{i,j}$, $j = 1, 2, \dots, |\Theta_i|$, is the j^{th} type of player i (this highlighted component is salient to incomplete information games because strategy of a player is complete plan of what it will do if it's type is so and so.).
 - And, $\sigma_i(\theta_{i,j}) = (\sigma_i(\theta_{i,j}, s_{i,1}), \sigma_i(\theta_{i,j}, s_{i,2}), \dots, \sigma_i(\theta_{i,j}, s_{i,|S_i|}))$ where $s_{i,k}$, $k = 1, 2, \dots, |S_i|$, is the k^{th} pure strategy of player i and hence $\sigma_i(\theta_{i,j}, s_{i,k})$ is the probability that player i will choose pure strategy $s_{i,k}$ if it's type is $\theta_{i,j}$.

Bayesian Games: Utility function

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MIXED STRATEGY

- Let $U_i(\theta, \sigma)$ denote the utility of player i if the type of the players is θ and strategy profile is σ .
- Now player i knows it's type, θ_i . But it does not know the type of other players, θ_{-i} . Hence, **for player i , θ_{-i} is a random variable** and consequently the function $U_i(\theta, \sigma) = U_i(\theta_i, \theta_{-i}, \sigma)$ is **function of random variable θ_{-i}** . But player i can find the expected value of $U_i(\theta, \sigma)$ conditioned on it's type being θ_i ; this is exactly the utility function of player i . Mathematically, **the utility of player i is**,

$$U_i(\sigma_i, \sigma_{-i} | \theta_i) = E[U_i(\theta, \sigma) | \theta_i] \quad (4)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} E[U_i(\theta, \sigma) | \theta_i, \theta_{-i}] P[\theta_{-i} | \theta_i] \quad (5)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i} | \theta_i] U_i(\theta_i, \theta_{-i}, \sigma_i(\theta_i), \sigma_{-i}(\theta_{-i})) \quad (6)$$

Bayesian Games: Utility function

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θ_i fixed because it is known to a player i .

$$= \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i} | \theta_i] U_i(\theta_i, \theta_{-i}, \sigma_i(\theta_i), \sigma_{-i}(\theta_{-i})) \quad (6)$$

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MIXED STRATEGY

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- Now player i knows it's type, θ_i . But it does not know the type of other players, θ_{-i} . Hence, **for player i , θ_{-i} is a random variable** and consequently the function $U_i(\theta, \sigma) = U_i(\theta_i, \theta_{-i}, \sigma)$ is **function of random variable θ_{-i}** . But player i can find the expected value of $U_i(\theta, \sigma)$ conditioned on it's type being θ_i ; this is exactly the utility function of player i . Mathematically, **the utility of player i is**,

$$U_i(\sigma_i, \sigma_{-i} | \theta_i) = E[U_i(\theta, \sigma) | \theta_i] \quad (4)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} E[U_i(\theta, \sigma) | \theta_i, \theta_{-i}] P[\theta_{-i} | \theta_i] \quad (5)$$

$$= \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i} | \theta_i] U_i(\theta_i, \theta_{-i}, \sigma_i(\theta_i), \sigma_{-i}(\theta_{-i})) \quad (6)$$

**Function
overloading**

Bayesian Games: Utility function

➤ In equations (2), (3), (5), 6), $P[\theta_{-i}|\theta_i]$ is the posterior probability of θ_{-i} given θ_i . Using, Bayes' rule,

$$P[\theta_{-i}|\theta_i] = \frac{P[\theta_{-i}, \theta_i]}{P[\theta_i]} \quad (7)$$

$$= \frac{P[\theta]}{P[\theta_i]} \quad (8)$$

$$= \frac{P[\theta]}{\sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i}, \theta_i]} \quad (9)$$

Bayesian Games: Utility function

- For equation (6), $U_i(\theta_i, \theta_{-i}, \sigma_i(\theta_i), \sigma_{-i}(\theta_{-i}))$ is the utility of player i in mixed strategy $\sigma(\theta) = (\sigma_i(\theta_i), \sigma_{-i}(\theta_{-i}))$. We have,

$$U_i(\theta_i, \theta_{-i}, \sigma_i(\theta_i), \sigma_{-i}(\theta_{-i})) = \sum_{s \in S} \sigma_i(\theta_i, s_i) \sigma_{-i}(\theta_{-i}, s_{-i}) u_i(\theta_i, \theta_{-i}, s_i, s_{-i})$$

Bayesian Games: Bayesian NE

- Just like Nash equilibrium (NE) in complete information games, we can define Bayesian Nash equilibrium in (BNE) in Bayesian games.

Definition (BNE in pure strategy): A strategy profile $s^* = (s_i^*, s_{-i}^*)$ is called a BNE in pure strategy if

$$U_i(s_i^*(\theta_i), s_{-i}^* \mid \theta_i) \geq U_i(s_i(\theta_i), s_{-i}^* \mid \theta_i), \forall s_i(\theta_i) \in S_i, \forall \theta_i \in \Theta_i, \forall i \in N$$

Same meaning...

The top one explicitly shows that θ_i is known for player i .

$$U_i(s_i^*, s_{-i}^* \mid \theta_i) \geq U_i(s_i, s_{-i}^* \mid \theta_i), \forall s_i \in S_i, \forall \theta_i \in \Theta_i, \forall i \in N$$

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The top one does
function overloading.

$$U_i(s_i^*, s_{-i}^* \mid \theta_i) \geq U_i(s_i, s_{-i}^* \mid \theta_i), \forall s_i \in S_i, \forall \theta_i \in \Theta_i, \forall i \in N$$

$s_i^*(\theta_i)$ is the strategy for
player i for only type θ_i .

While s_{-i}^* is the strategy of the
other players for all their possible types.

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$$U_i(s_i^*, s_{-i}^* \mid \theta_i) \geq U_i(s_i, s_{-i}^* \mid \theta_i), \forall s_i \in S_i, \forall \theta_i \in \Theta_i, \forall i \in N$$

Definition (BNE in pure strategy, Best response version): A strategy profile $s^* = (s_i^*, s_{-i}^*)$ is called a BNE in pure strategy if

$$s_{i, \theta_i}^* \in B_i(s_{-i}^*, \theta_i), \forall \theta_i \in \Theta_i, \forall i \in N$$

where,

$$B_i(s_{-i}, \theta_i) = \arg \max_{s_i, \theta_i \in S_i} U_i(s_i, s_{-i} \mid \theta_i)$$

Bayesian Games: Bayesian NE

- Just like Nash equilibrium (NE) in complete information games, we can define Bayesian Nash equilibrium in (BNE) in Bayesian games.

Definition (BNE in mixed strategy): A strategy profile $\sigma^* = (\sigma_i^*, \sigma_{-i}^*)$ is called a BNE in mixed strategy if

$$U_i(\sigma_i^*(\theta_i), \sigma_{-i}^* \mid \theta_i) \geq U_i(\sigma_i(\theta_i), \sigma_{-i}^* \mid \theta_i), \forall \sigma_i(\theta_i) \in \Delta(S_i), \forall \theta_i \in \Theta_i, \forall i \in N$$

$$U_i(\sigma_i^*, \sigma_{-i}^* \mid \theta_i) \geq U_i(\sigma_i, \sigma_{-i}^* \mid \theta_i), \forall \sigma_i(\theta_i) \in \Delta(S_i), \forall \theta_i \in \Theta_i, \forall i \in N$$

Definition (BNE in mixed strategy, Best response version): A strategy profile $\sigma^* = (\sigma_i^*, \sigma_{-i}^*)$ is called a BNE in mixed strategy if

$$\sigma_{i, \theta_i}^* \in B_i(\sigma_{-i}^*, \theta_i), \forall \theta_i \in \Theta_i, \forall i \in N$$

where,

$$B_i(\sigma_{-i}, \theta_i) = \arg \max_{\sigma_i, \theta_i \in \Delta(S_i)} U_i(\sigma_i, \sigma_{-i} \mid \theta_i)$$

Relation between Bayesian NE and NE

➤ For a strategy profile $\sigma = (\sigma_i, \sigma_{-i})$ define,

$$U_i(\sigma_i, \sigma_{-i}) = \sum_{\theta_i \in \Theta_i} P[\theta_i] U_i(\sigma_i, \sigma_{-i} | \theta_i)$$

$U_i(\sigma_i, \sigma_{-i})$: Expected utility of player i for strategy profile $\sigma = (\sigma_i, \sigma_{-i})$ **before** player i learns its type. This is also called **ex-ante utility**.

$U_i(\sigma_i, \sigma_{-i} | \theta_i)$: Expected utility of player i for strategy profile $\sigma = (\sigma_i, \sigma_{-i})$ **after** player i learns its type. This is also called **ex-interim utility**.

$P[\theta_i]$: The probability that type of player i is θ_i . $P[\theta_i]$ can be computed from prior probability as follows,

$$P[\theta_i] = \sum_{\theta_{-i} \in \Theta_{-i}} P[\theta_{-i}, \theta_i]$$

Obviously **$P[\theta_i] > 0$** for all $\theta_i \in \Theta_i$. Otherwise, if $P[\theta_i] = 0$, θ_i is not even a type of player.

Relation between Bayesian NE and NE

- There is a concept of NE (hence PSNE and MSNE) for Bayesian game too.

Definition (NE in mixed strategy): A strategy profile $\sigma^* = (\sigma_i^*, \sigma_{-i}^*)$ is called a mixed strategy if

$$U_i(\sigma_i^*, \sigma_{-i}^*) \geq U_i(\sigma_i, \sigma_{-i}^*) \quad \forall \sigma_i \in \Delta(S_i), \forall i \in N$$

Physical meaning: NE in Bayesian game is to check if a strategy profile is a NE if the nature did not tell the player their own types.

Relation between Bayesian NE and NE

➤ There is a concept of NE (hence PSNE and MSNE) for Bayesian game too.

Theorem 1: If the set of types of all the players are finite, a strategy profile $\sigma^* = (\sigma_i^*, \sigma_{-i}^*)$ is a BNE **if and only if** it is a NE.

Very non-intuitive: It essentially means:

No player has a profitable unilateral deviation **after he/she knows which type** he/she is **if and only if** he/she has no profitable unilateral deviation **before knowing his/her type**.

Intuition?

Importance: Theorem 1 implies that computing BNE is same as computing NE in complete information games but **each player has a vector of strategies** depending on its type. **This is however true only if set of types of all the players are finite.** If the set of types is NOT finite, we can **directly compute the BNE**.

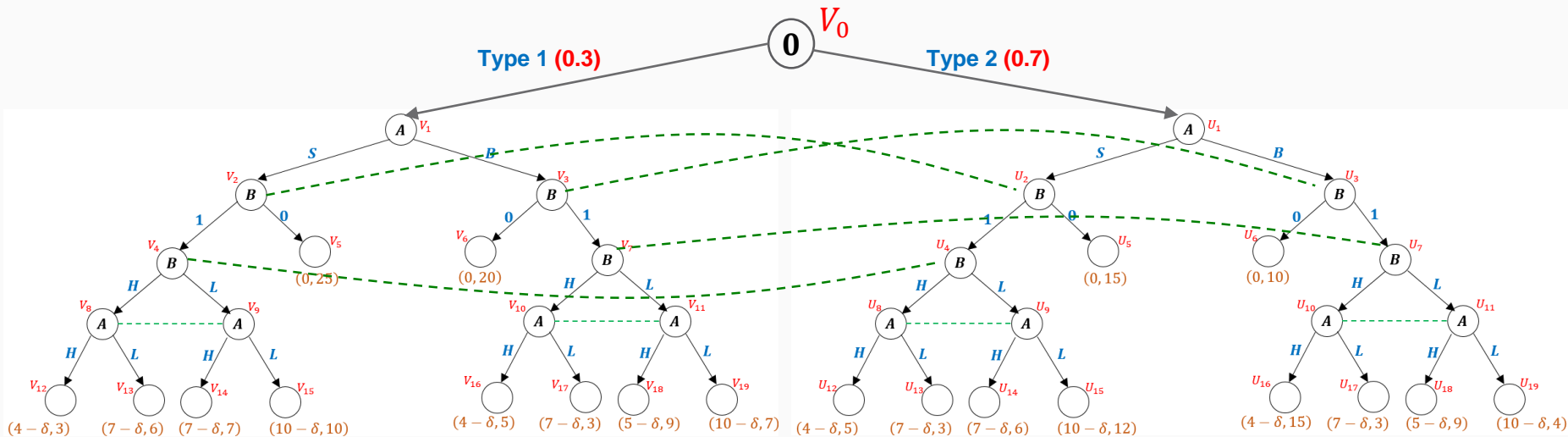
Bayesian Games: Sequential Move Games

- Bayesian Games with sequential moves can be captured using the same approach which we used to capture complete information sequential move games but with **nature node making the FIRST decision about the type of the players** and then **constructing information sets to ensure that a player knows its type but not the type of other players**.
- In the next two slides, we do two examples to demonstrate the above idea. The example that we use is derived from question 1 of minor 1 (so check that first in the exam folder to refresh your idea). The difference is:
 - Example 1: Company A has two types. Company B has one type.
 - Example 2: Company B has two types. Company A has one type.

I did not do the case where both the company has two types because it is going to be messy! **Also, note that in the leaf nodes, of the EFGs drawn in the next two slides, company B's payoff comes first.**
- After we can model the Bayesian Games with sequential moves as discussed above, we can use the same solution approach as we discussed in lectures 19 and 20.

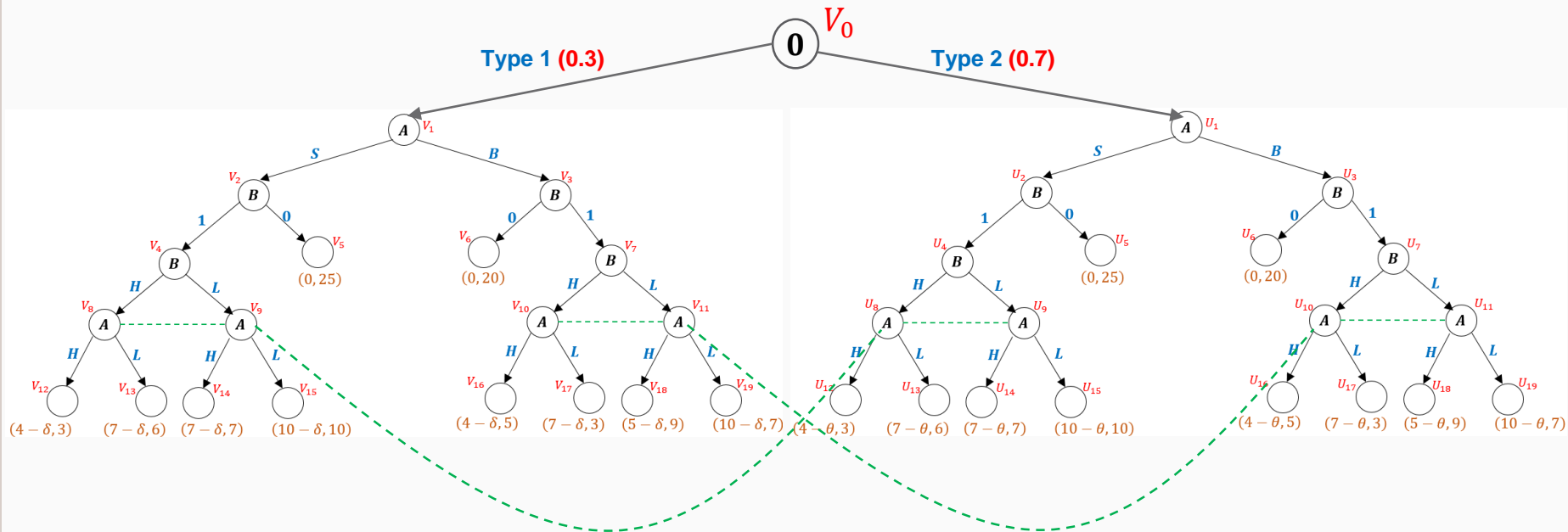
Bayesian Games: Sequential Move Games

Company A has two types



Bayesian Games: Sequential Move Games

Company B has two types





Thank You!