

Dynamic Games among Teams with Asymmetric Information

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Workshop on *Large Population Teams:
Control, Equilibria, and Learning*

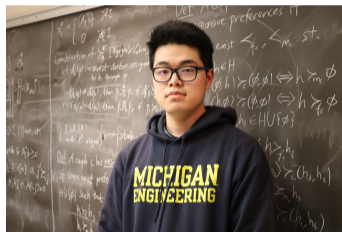
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Collaborators

Dynamic Games
among Teams with
Asymmetric
Information

Vijay Subramanian

- **Dengwang Tang** (Ebay), Hamidreza Tavafoghi (Google), Ashutosh Nayyar (USC) & Demosthenis Teneketzis (UMichigan)



Background

Problem Formulation

Main Results

Step 0: Transform Teams to
Individuals

Step 1: Compress Private
Information

Step 2: Compress Common
Information

Conclusions

Multi-Agent (Dynamic) Systems

Dynamic Games
among Teams with
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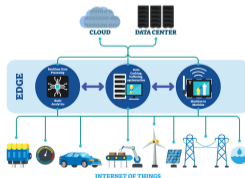
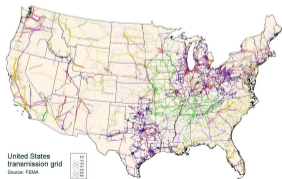
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Conclusions

- Multiple agents take actions *over time* on top of an *ever changing* system/environment to achieve their respective objectives.
- Agents have different information about the systems and about each other.
- Multi-agent systems have a wide range of applications.



Multi-Agent (Dynamic) Systems

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- **Team:** Agents have aligned objectives and jointly decide on their strategies.
- **Game:** Agents have different objectives and do not collaborate.
- **Focus of this talk:** *Games among teams*

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Conclusions

■ Automated vehicles in future cities

- Automated vehicles roam around the city to serve customers.
- Vehicles from the same company collaborate to serve customers more efficiently.
- Fleets from different companies compete with each other.

■ DARPA Spectrum Collaboration Challenge

- Transceivers work in teams.
- Teams compete with each other for spectrum resource.
- A team collaborates to sense the spectrum landscape, avoid interference, and exploit opportunities to achieve efficient use of spectrum.



Information Asymmetry

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- Information asymmetry is ubiquitous.
- It exists among all agents, whether they are in the same team or not.
- Why cannot members in the same team simply communicate to overcome information asymmetry?
 - Physical constraints
 - Communication delay vs. real-time requirement
 - High cost of communication
 - Possibility of being eavesdropped by other teams



- Challenges of dynamic games with asymmetric information, among individuals or among Teams:
 - Interdependence of decision and information over time
 - Domain of strategy growing over time
 - *Dependence of belief on strategies*
 - Coordination within teams to achieve team optimality
- **This talk:** Show how to address these challenges in a specialized model ¹.

¹D. Tang, H. Tavafoghi, V. S., A. Nayyar and D. Teneketzis (2023). Dynamic games among teams with delayed intra-team information sharing. *Dynamic Games and Applications*, 13(1), 353-411.

“Existing Work” on Dynamic Games

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Conclusions

- Repeated games.
- Zero-sum dynamic games.
- [Maskin, Tirole 2001]
 - *Model assumption*: The system states and actions are publicly observable.
 - *Result*: Agents can make decisions based on the Markov state instead of full information. A sequential decomposition procedure to determine such Perfect equilibria.
- [Nayyar, Gupta, Langbort, Basar 2013]
 - *Model assumption*: Common information based belief is strategy independent.
 - *Result*: Agents can make decisions based on a compression of common information. A sequential decomposition procedure to determine such Bayes Nash equilibria.
- [Ouyang, Tavafoghi, Teneketzis 2016]
 - Similar model to ours, except in games of individuals.
 - *Result*: A sequential decomposition procedure to determine compression based Weak Perfect Bayesian equilibria.

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- [Vasal, Sinha, Anastasopoulos 2019]
 - Similar model to ours, except in games of individuals.
 - *Result*: A sequential decomposition procedure to determine compression based Weak Perfect Bayesian equilibria.
- [Ouyang, Tavafoghi, Teneketzis 2024]
 - *Model assumption*: General finite game model with *hidden actions*.
 - *Result*: Agents can make decisions based on an elaborate compression of common information that accounts for hidden actions. A sequential decomposition procedure to determine such Bayes Nash equilibria.
- [Tang, S., Teneketzis 2024] (*Under review*)
 - General finite game model.
 - *Result*: Develop criteria for strategy-independent information compression maps to preserve some or all equilibria—Bayes Nash (BN) and Sequential equilibrium.

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System Model

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Conclusions

- We consider a **FINITE** stochastic dynamic game:

- Time indices: $\mathcal{T} = \{1, 2, \dots, T\}$, $T < +\infty$.
- Set of teams: $\mathcal{I} = \{1, 2, \dots, I\}$, $I < +\infty$.
- Set of Team i 's members:
 $\mathcal{N}_i = \{(i, 1), (i, 2), \dots, (i, N_i)\}$, $N_i < +\infty$.

- At time $t \in \mathcal{T}$:

- Agent (i, j) 's action (finite-valued): $U_t^{i,j}$.
- Team i 's dynamical system (finite-valued): $\mathbf{X}_t^i = (X_t^{i,j})_{(i,j) \in \mathcal{N}_i}$.
- System evolution:

$$\mathbf{X}_{t+1}^i = f_t^i(\mathbf{X}_t^i, \mathbf{U}_t, W_t^{i,X}), \quad i \in \mathcal{I}$$

where $\mathbf{U}_t = (U_t^{k,j})_{(k,j) \in \mathcal{N}_k, k \in \mathcal{I}}$ is the action profile,
and $(W_t^{i,X})_{i \in \mathcal{I}, t \in \mathcal{T}}$ are the system noises.

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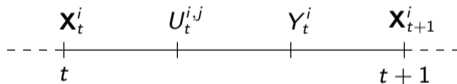
Conclusions

- All actions are publicly observable.
- Noisy public observation: $\mathbf{Y}_t = (Y_t^i)_{i \in \mathcal{I}}$

$$Y_t^i = \ell_t^i(\mathbf{X}_t^i, \mathbf{U}_t, W_t^{i,Y})$$

where $(W_t^{i,Y})_{i \in \mathcal{I}, t \in \mathcal{T}}$ are the observation noises.

- Timeline:



- Agent (i, j) can observe $X_t^{i,j}$ perfectly.
- Agents in the same team communicate their states with a delay of d .
- $(\mathbf{X}_1^i)_{i \in \mathcal{I}}, (W_t^{i,X})_{i \in \mathcal{I}, t \in \mathcal{T}}, (W_t^{i,Y})_{i \in \mathcal{I}, t \in \mathcal{T}}$ are mutually independent primitive random variables.
- Model specification is common knowledge among all agents.

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Conclusions

- Common information among all teams:

$$H_t^0 = (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1})$$

- Common information within team i :

$$H_t^i = (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}, \mathbf{X}_{1:t-d}^i)$$

- Agent (i, j) 's information:

$$H_t^{i,j} = (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}, \mathbf{X}_{1:t-d}^i, X_{t-d+1:t}^{i,j})$$

Reward Functions

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- Team i 's strategy profile:
 - Pure strategy: $\mu^i = (\mu_t^{i,j})_{(i,j) \in \mathcal{N}_i, t \in \mathcal{T}}$ where $\mu_t^{i,j} : \mathcal{H}_t^{i,j} \mapsto \mathcal{U}_t^{i,j}$.
 - Mixed strategies: σ^i , a distribution over pure strategies.
 - Team members' strategies can be correlated!
 - Joint randomization is critical for equilibrium existence!
- Total reward
 - Total reward under a pure strategy profile $\mu = (\mu^i)_{i \in \mathcal{I}}$:

$$J^i(\mu) = \mathbb{E}^\mu \left[\sum_{t=1}^T r_t^i(\mathbf{X}_t, \mathbf{U}_t) \right],$$

where the functions r_t^i represents the instantaneous rewards.

- Total reward under a mixed strategy profile: average of total rewards under pure strategy profiles, i.e.

$$J^i(\sigma) = \sum_{\mu} J^i(\mu) \prod_{i \in \mathcal{I}} \sigma^i(\mu^i)$$

Solution Concept

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Conclusions

- Team Bayesian Nash Equilibrium (TBNE): A mixed strategy profile $\sigma = (\sigma^i)_{i \in \mathcal{I}}$ where

$$J^i(\sigma^i, \sigma^{-i}) \geq J^i(\tilde{\sigma}^i, \sigma^{-i})$$

for all mixed strategy profile $\tilde{\sigma}^i$ of team i .

- **Objective:** *While preserving the given information structure*
 - Characterize sub-classes of TBNE where agents can compress their information
 - Devise a sequential decomposition procedure to determine these TBNE

Deviations can be arbitrarily complex (given the information structure)!

Result Overview

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Conclusions

- We transform the game among teams into a game among individual players, where the players are *coordinators*.
 - The game among coordinators will be a dynamic game with asymmetric information. Coordinators will have *common information* and *private information*.
- We introduce a subclass of strategies where *coordinators* compress their *private information*.
 - We show that equilibria always exist in this subclass.
- We introduce a subclass of strategies where *coordinators* compress both their *common information* and *private information*.
 - We develop a sequential decomposition procedure whose solution (if it exists) forms an equilibrium in this subclass.
 - We show that equilibria may not exist in this subclass.

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Coordinators' Approach [NMT 2013]

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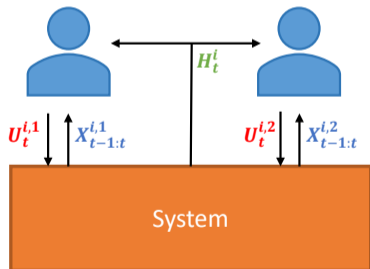
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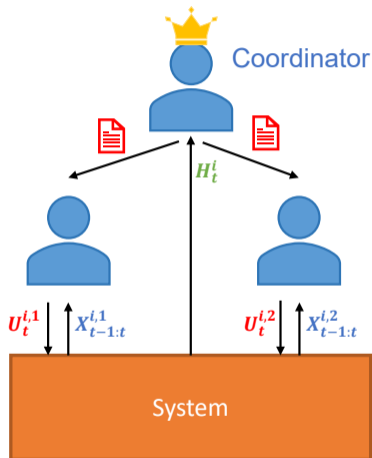
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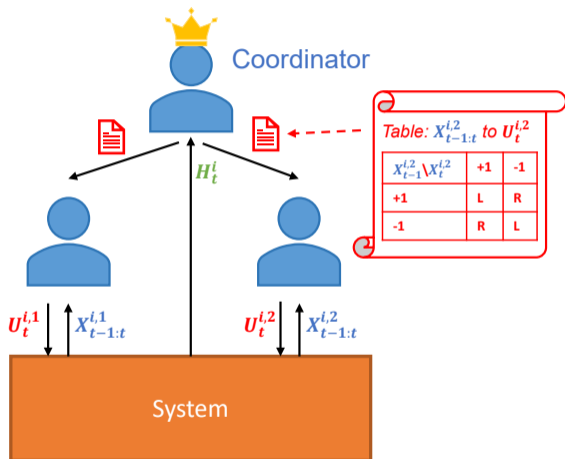
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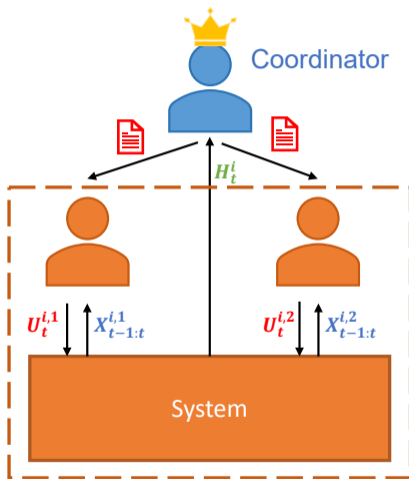
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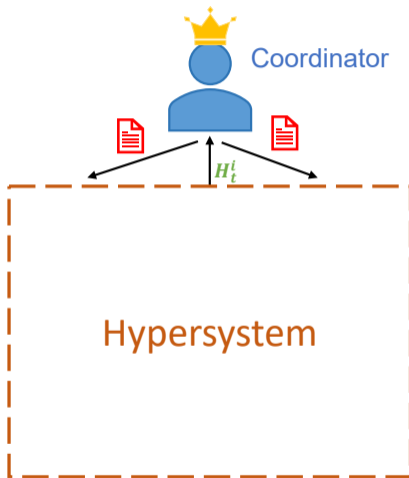
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Game among Coordinators

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Conclusions

- The transformation neither enriches nor reduces the strategy space of a team—joint randomization within team is critical for this!
- Coordinator i 's “action” at time t : $\mathbf{\Gamma}_t^i = (\Gamma_t^{i,j})_{(i,j) \in \mathcal{N}_i}$.
 - $\Gamma_t^{i,j}$ instructs agent (i, j) to choose her action.
- Behavioral strategies of a coordinator (Behavioral Coordination Strategies): $g_t^i : \mathcal{H}_t^i \times \Gamma_{1:t-1}^i \mapsto \Delta(\Gamma_t^i)$
 - That is, choose randomized prescriptions based on H_t^i , and past prescriptions.
- Can analyze *Coordinator's Bayesian Nash Equilibrium* (CBNE) in *behavioral coordination strategies* instead! (*Kuhn's theorem applies*)

Information Structure of the Coordinators

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Conclusions

- The game among coordinators is a dynamic game with asymmetric information.

- All coordinators know

$$H_t^0 = (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1})$$

- Coordinator i knows

$$\bar{H}_t^i = (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}, \mathbf{X}_{1:t-d}^i, \mathbf{\Gamma}_{1:t-1}^i)$$

- No coordinator knows $\mathbf{X}_{t-d+1:t}$!

- We will refer to

- $\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}$ as the **Common Information**;
- $\mathbf{X}_{1:t-d}^i, \mathbf{\Gamma}_{1:t-1}^i$ as coordinator i 's **Private Information**.
- $\mathbf{X}_{t-d+1:t}$ as the **Hidden States**.

Compression of Information

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Conclusions

- Now we have completed Step 0: transform teams into coordinators.
- The game among coordinators is still complicated.
 - Both the common information and the private information are growing with time.
 - Coordinators' actions and information are interdependent over time.
 - **Coordinators' actions (prescriptions) are private information.**
- The results of [OTT 2016] do not directly apply! (*OTT 2024 does.*)
- **Key Questions:**
 - Do there exist equilibria where coordinators can compress their information?
 - Can we develop a sequential decomposition procedure to find such equilibria, if they exist?

Deviations can be arbitrarily complex!

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Conclusions

- Coordinator i 's private information at time t is $(\mathbf{X}_{1:t-d}^i, \mathbf{\Gamma}_{1:t-1}^i)$
- However, we show that coordinator i only need to use the *Sufficient Private Information* (SPI) S_t^i , given by

$$S_t^i = (\mathbf{X}_{t-d}^i, \mathbf{\Phi}_t^i) \quad (1)$$

where $\mathbf{\Phi}_t^i$ is the *partially realized prescriptions* (PRP).

- PRP: the $(d - 1)$ most recent prescriptions evaluated at the current information of the coordinator.

Partially Realized Prescriptions

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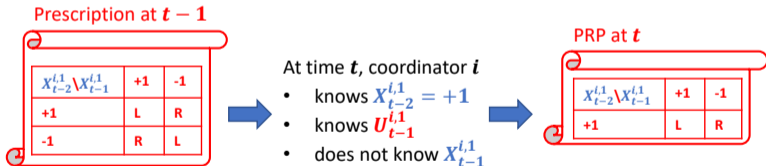
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Conclusions

- PRP summarizes how hidden states were mapped to actions in the past, provided what is known.
- $d = 1$: Φ_t^i is empty.
- $d = 2$: $\Phi_t^i = (\Gamma_{t-1}^{i,j}(X_{t-2}^{i,j}, \cdot))_{(i,j) \in \mathcal{N}_i}$.



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Conclusions

- We refer to such strategies as *Sufficient Private Information-Based* (SPIB) strategies, ...
i.e. strategies that uses (H_t^0, S_t^i) instead of $(H_t^0, \mathbf{X}_{1:t-d+1}^i, \mathbf{\Gamma}_{1:t-1}^i)$ to choose randomized prescriptions.
- SPIB strategies are simpler to implement than generic behavioral coordination strategies:
 - Size of $S_t^i = (\mathbf{X}_{t-d}^i, \mathbf{\Phi}_t^i)$ does not grow with time.
 - $S_t^i = (\mathbf{X}_{t-d}^i, \mathbf{\Phi}_t^i)$ can be sequentially updated as new information comes in.

Theorem (T., T., S., N., T.)

There exists CBNE where all coordinators use SPIB strategies.

Remark: Existence of equilibria is typically established under the assumption of full recall, but using an SPIB strategy means giving up full recall.

Proof Sketch:

- Restrict attention to ϵ -trembling strategies of coordinators, where all prescriptions have probability $\geq \epsilon$.
- Fixing g^{-i} , coordinator i 's decision problem is equivalent to an MDP with state (H_t^0, S_t^i) .
- Define a best response correspondence using the sequential decomposition of this MDP.
- Using Kakutani's fixed point theorem to argue the existence of ϵ -trembling-SPIB-strategy-based equilibria.
- Take the limit as ϵ goes to 0.

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- Recall: Coordinator i 's information is $(\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}, \mathbf{X}_{1:t-d}^i, \mathbf{\Gamma}_{1:t-1}^i)$
 - We have compressed the private information $(\mathbf{X}_{1:t-d}^i, \mathbf{\Gamma}_{1:t-1}^i)$ to S_t^i which has a time invariant domain.
 - The common information $(\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1})$ is still growing with time!
- How can we compress the common information?

And how can we develop a sequential decomposition of the game?

Motivation:

- In decentralized control [NMT 2013] ... and multiple settings of dynamic games [NGLB 2013][OTT 2016][VSA 2019],...
common information based belief on private information and state forms an information state.
- Sequential decomposition procedures are developed based on this information state.

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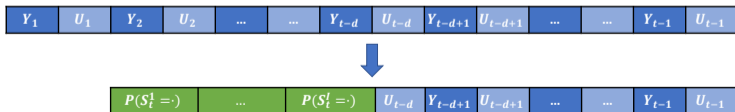
Step 2: Compress Common
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Conclusions

- Idea: Compress the common information to the belief on sufficient private information and hidden states, i.e.

$$\mathbb{P}(\mathbf{S}_t = \cdot, \mathbf{X}_{t-d+1:t} = \cdot | H_t^0)$$

- Using special properties of this model, it can be shown that this belief can be expressed as a function of
 - Beliefs on SPI, i.e. $\mathbb{P}(S_t^k = \cdot | H_t^0)$ for each $k \in \mathcal{I}$.
 - Uncompressed values of $(\mathbf{Y}_{t-d+1:t-1}, \mathbf{U}_{t-d:t-1})$.
- Refined Idea: Compress the common information to B_t , a vector composed of the above objects.



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- However, the beliefs $\mathbb{P}(S_t^k = \cdot | H_t^0)$, $k \in \mathcal{I}$ are strategy dependent.
 - It can be sequentially computed with Bayes rule at each time t , but the rule depends on the strategy profile of the coordinators.

- Unlike the compression of private information into S_t^i , there is no fixed way to compute the compression of common information.

- We have to determine the compression and the strategies at the same time.

Compressed Information Based Strategy

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Conclusions

- A *Compressed Information-Based* (CIB) strategy profile is composed of two parts:

- *Belief generation system* ψ^i :

Defines how coordinator i sequentially updates the beliefs

$$\Pi_t^{i,k} = \mathbb{P}(S_t^k = \cdot | H_t^0), k \in \mathcal{I} \text{ from } H_t^0.$$

- *Belief based strategy* λ^i :

Defines how coordinator i map all her compressed information to prescriptions.

$$\left. \begin{array}{l} (\mathbf{Y}_{1:t-1}, \mathbf{U}_{1:t-1}) \xrightarrow{\psi_{1:t-1}^i} \Pi_t^{i,1:l} \\ (\mathbf{Y}_{t-d+1:t-1}, \mathbf{U}_{t-d:t-1}) \end{array} \right\} B_t^i \xrightarrow{\lambda_t^i} (\text{randomized}) \Gamma_t^i$$
$$(\mathbf{X}_{1:t-d}, \mathbf{\Gamma}_{1:t-d}) \xrightarrow{\quad\quad\quad} S_t^i$$

- CIB strategies forms a subclass of SPIB strategies.

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Conclusions

- We are interested in CIB strategies with reasonable belief generation systems.
- Following similar approach in [OTT 2016], we focus on the subclass of CBNE (called CIB-CBNE) where
 - i Coordinator i plays CIB strategy profile (λ^i, ψ^i)
 - ii $\psi^i = \psi^*$ for all $i \in \mathcal{I}$;
 - iii ψ^i is consistent with $(\lambda^k)_{k \in \mathcal{I}}$ under Bayes rule for all $i \in \mathcal{I}$;
- When condition (ii) holds, all coordinators have the same *compressed common information* B_t , and it is common knowledge.
- When condition (iii) holds, the common information-based beliefs generated by the coordinators are objective beliefs.

Sequential Decomposition

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Conclusions

- When the condition of CIB-CBNE holds, the *compressed common information* B_t can be seen as a summary of the past that is agreed by all coordinators.
 - It can be used to derive objective beliefs on the states and information at or after time t .
 - The decision problem for the coordinators at time t can be seen as a new game (starting at time 0) parametrized by B_t (Call it $G_{\geq t}(B_t)$).
- Same observation holds true for $t + 1$!
- This observation suggests a sequentially decomposition procedure where the game is decomposed into *stage problems* with information state B_t .

Stage Problem

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- Suppose that we have already know the interim expected payoff-to-go at equilibrium in $G_{\geq t+1}(b_{t+1})$ for every realization of CCI b_{t+1} , given by the value functions $V_{t+1} = (V_{t+1}^i)_{i \in \mathcal{I}}$.
- Suppose that we restrict all coordinators to use belief update rule ψ_t^* , then coordinators are essentially playing the following game at time t :

Stage Game $G_t(V_{t+1}, b_t, \psi_t^*)$:

- Value functions V_{t+1} , realization of CCI b_t , belief update rule ψ_t^* are commonly known.
- Coordinator i observes her type $S_t^i = s_t^i$.
- Coordinator i selects a prescription Γ_t^i .
- Coordinator i has utility

$$\mathbb{E}[r_t^i(\mathbf{X}_t, \mathbf{U}_t) + V_{t+1}^i(B_{t+1}, S_{t+1}^i) | b_t, s_t^i, \Gamma_t^i]$$

where the beliefs in B_{t+1} is computed with ψ_t^* and b_t .

- If we can find an equilibrium strategy profile of the above game that is consistent with ψ_t^* under Bayes rule, we have found an equilibrium for $G_{\geq t}(b_t)$. (Why?)

Closedness of CIB Strategies

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- This is because of the *closedness property*:

Lemma (T., T., S., N., T.)

Suppose that all coordinators other than coordinator i are using CIB strategies. Let $(\lambda^k, \psi^k)_{k \in \mathcal{I} \setminus \{i\}}$ be the CIB strategy profile of coordinators other than i . Suppose that

- $\psi^j = \psi^k$ for all $j, k \in \mathcal{I} \setminus \{i\}$
- ψ^j is consistent with $(\lambda^k)_{k \in \mathcal{I} \setminus \{i\}}$ under Bayes rule.

Then, a best-response strategy for coordinator i is a CIB strategy with the same belief generation system as the other coordinators.

- *Proof Idea:* Fixing all other coordinators' strategies, let B_t^i be sequentially computed with $\psi^i = \psi^k, k \neq i$. B_t^i contains the true belief of other coordinators' SPI. Then one can argue that coordinator i faces an MDP with state (B_t^i, S_t^i) .

Sequential Decomposition

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Theorem (\mathcal{T} ., \mathcal{T} ., \mathcal{S} ., \mathcal{N} ., \mathcal{T} .)

Let $(\lambda^{*i}, \psi^*)_{i \in \mathcal{I}}$ be a CIB strategy profile with identical belief generation system ψ^* for all $i \in \mathcal{I}$. If this strategy profile satisfies the dynamic program:

$$V_{T+1}^i(\cdot, \cdot) = 0 \quad \forall i \in \mathcal{I};$$

and for $t \in \mathcal{T}$, $b_t \in \mathcal{B}_t$

- $\lambda_t^*(b_t, \cdot)$ is an Interim BNE of the stage game $G_t(V_{t+1}, b_t, \psi_t^*)$;
- $\psi_t^*(b_t, \cdot)$ is consistent with $\lambda_t^*(b_t, \cdot)$ under Bayes rule;
- $V_t^i(b_t, s_t^i)$ is the interim expected utility of player i in the stage game $G_t(V_{t+1}, b_t, \psi_t^*)$ for all $s_t^i \in S_t^i$ and $i \in \mathcal{I}$,

then $(\lambda^{*i}, \psi^*)_{i \in \mathcal{I}}$ forms an CBNE.

- The sequential decomposition procedure does not always have a solution—the paper provides two instances where a solution exists.

Conclusions

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Conclusions

- Dynamic games among teams with asymmetric information has many applications.
- We transform games among teams to games among individuals with the coordinator's approach.
- We developed a general approach to characterize a subset of Nash Equilibria with the following feature: At each time, each agent can make their decision based on a compressed version of their information.
- We identified two subclasses of strategies:
 - Sufficient private information-based (SPIB) strategies, which only compresses private information;
 - Compressed information-based (CIB) strategies, which compresses both common and private information.
- We showed that while SPIB-strategy-based equilibria always exist, CIB strategy-based equilibria do not always exist.
- We developed a backward inductive sequential procedure, whose solution (if it exists) is a CIB strategy-based equilibrium.

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Gracie mille!
Thank you!



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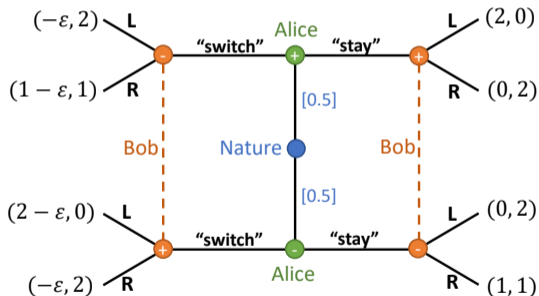
Existence I

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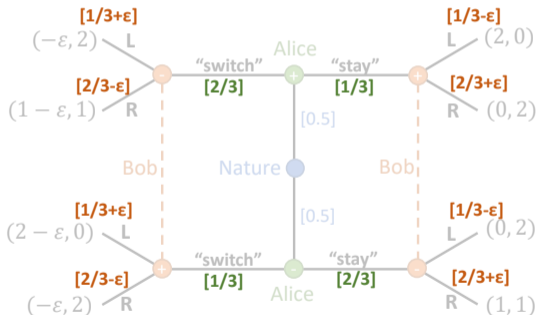
- In fact, CIB-CBNE does not always exist!

Example:



Existence II

- There is only one Bayes Nash Equilibrium in the above game. In this equilibrium both players play mixed strategies:



- Given Alice's strategy, the Bayes consistent belief at stage 2 satisfies:

$$\mathbb{P}(\text{"+"} \mid \text{"switch"}) = \mathbb{P}(\text{"+"} \mid \text{"stay"}) = \frac{1}{3}$$

- Bob faces the same decision problem under "switch" and "stay," i.e.



- Bob is indifferent between L and R in this situation.
- However, at equilibrium, Bob chooses different randomization under "switch" and "stay" ...
 - Bob uses more than his belief to make decision!