

Equilibrium Refinements for Multi-Agent Influence Diagrams: Theory and Practice

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BACKGROUND:

Multi-agent influence diagrams (MAIDs) are a popular form of graphical model that can offer key advantages over traditional extensive form game (EFG) representations:

- Compactness.
- Can exploit conditional independencies.
- Nash equilibria can be found more efficiently.
- A setting for causal queries (interventions or counterfactuals), which allows for incentives analysis in games.

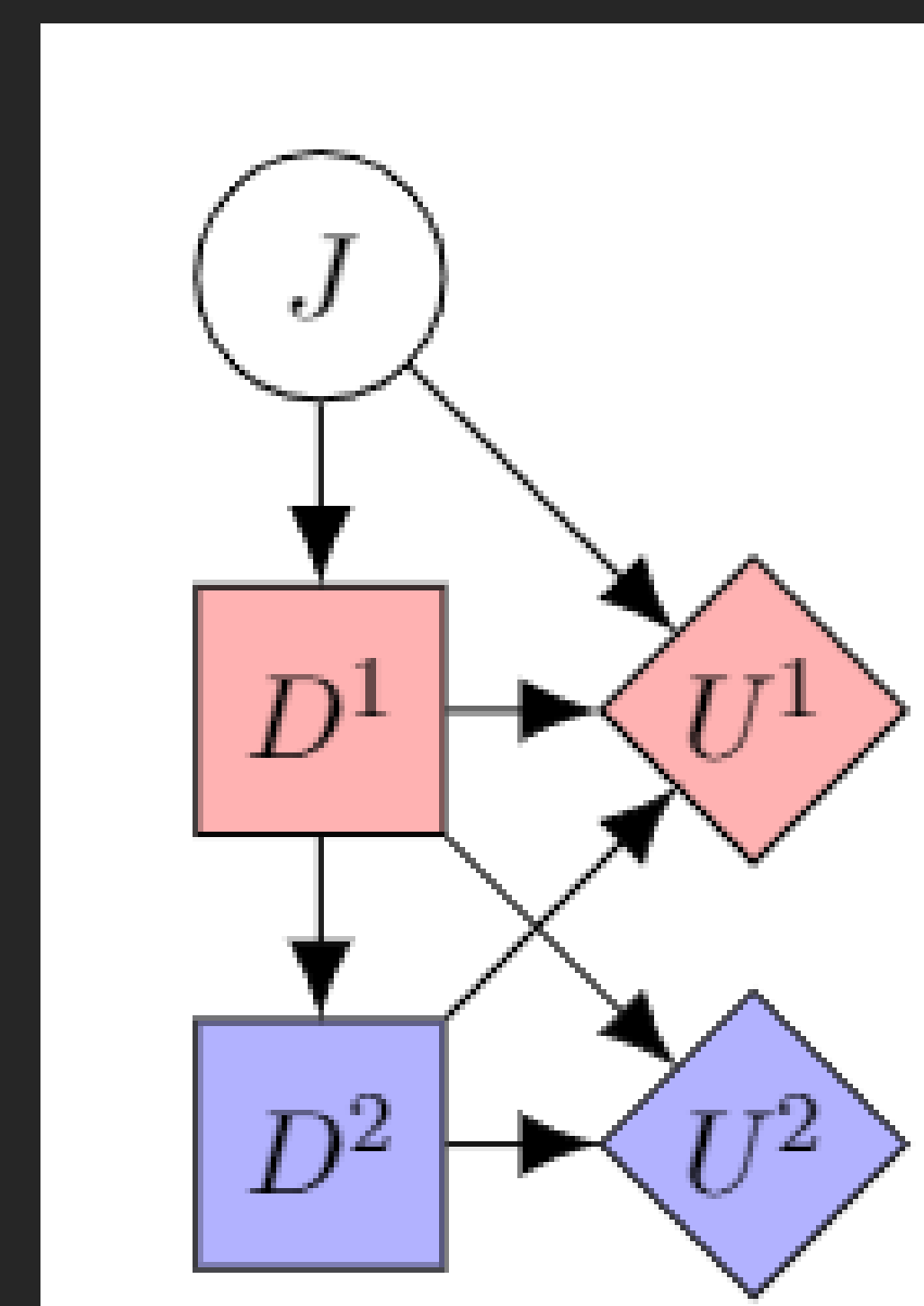
We introduce two important game theoretic concepts into MAIDs and prove several equivalence results between MAIDs and EFGs:

- Subgames.
- Equilibrium refinements (Subgame Perfectness and Trembling Hand Perfectness).

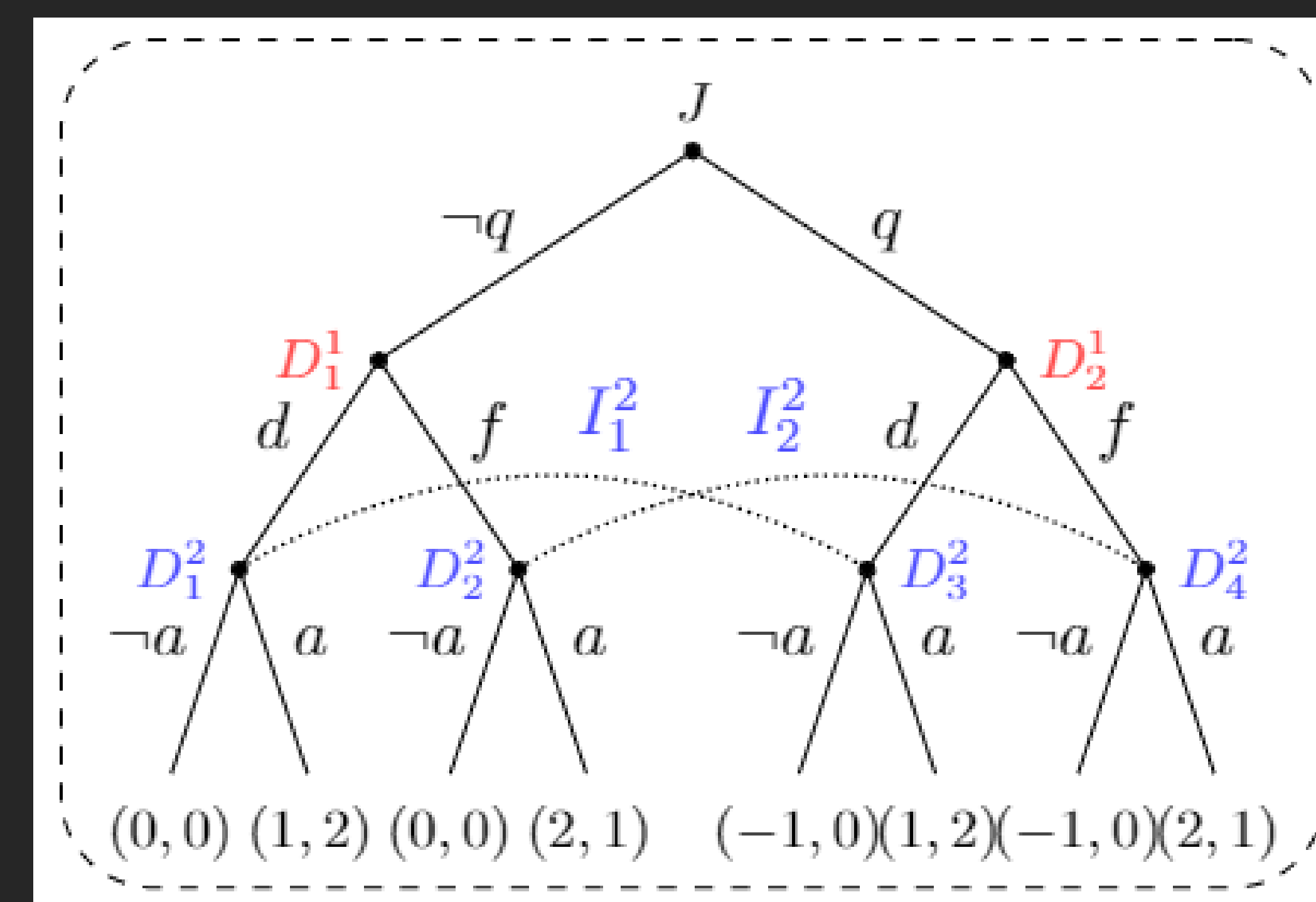
Key Definitions (see paper for formal definitions):

- A **multi-agent influence diagram (MAID)** is a triple (N, \mathbf{V}, E) where N is a set of agents and (\mathbf{V}, E) is a directed acyclic graph with \mathbf{V} partitioned into decision, chance and utility variables for each agent. A **multi-agent influence model (MAIM)** is a parameterized MAID - it adds CPDs $P(V|Pa_V)$ to every non-decision variable $V \in \mathbf{V}/\mathbf{D}$.
- A **Nash equilibrium (NE)** is a policy profile π in a MAIM such that no agent may benefit by unilaterally deviating (i.e., $\forall i \in N, EU^i(\pi^i, \pi^{-i}) \geq EU^i(\hat{\pi}^i, \pi^{-i}) \forall \hat{\pi}^i \in \Pi^i$)
- A node V is **r-reachable** from a decision $D \in \mathbf{D}^i$ in a MAID, $M = (N, \mathbf{V}, E)$ if a newly added parent \hat{V} of V satisfies $\hat{V} \perp U^i \cap \text{Desc}_D \mid \text{Fa}_D$.
- A **MAID subgame** is a subgraph of a MAID that is closed under r-reachability and mediators. A **MAIM subgame** is a parameterized MAID subgame with some setting of the variables outside the subgame.
- A full policy profile π is a **MAIM-subgame perfect equilibrium** in a MAIM M if π is an NE in every MAIM-subgame of M .

Multi-agent Influence Diagrams offer a compact and complete alternative graphical representation of games



VS



This work:



AAMAS 2021

What's next?



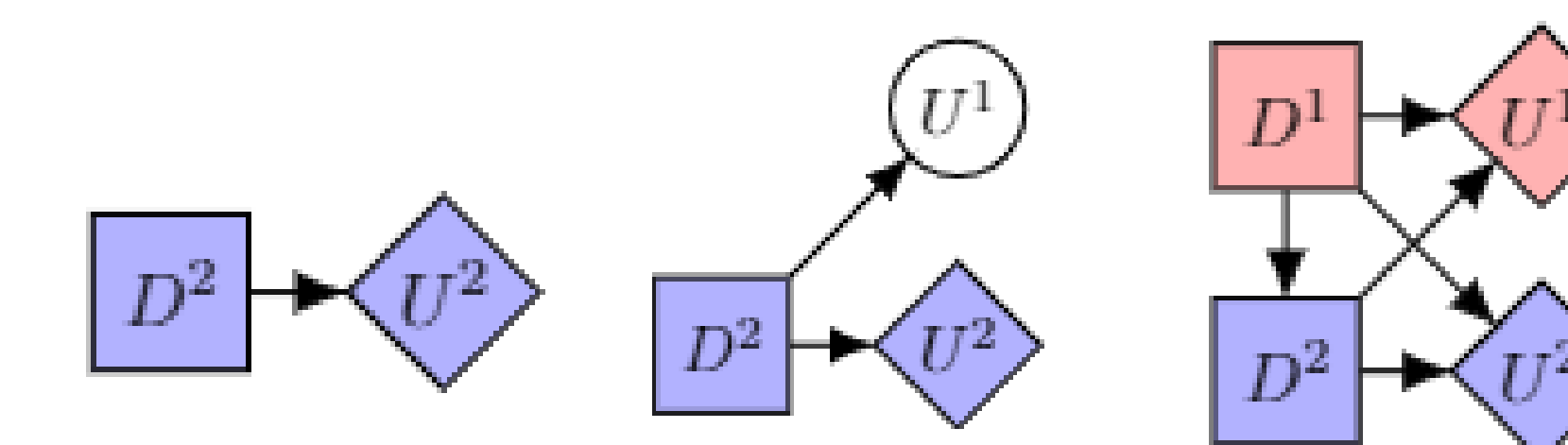
Agent Incentives: A Causal Perspective (AAI 2021)

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Taxi Example:

A taxi-driver (agent 1) decides (D^1) whether to offer a discount to a potential customer (agent 2) depending on how many journeys it has already given that day (J). The customer decides (D^2) whether to accept a journey in this taxi depending on the price offered. The driver wants to maximise profit, which is greater if the customer buys at a higher price; however, if the driver hasn't given enough journeys that day and the customer rejects them, the driver must pay a penalty (the local council uses this penalty as a mechanism to prevent a proliferation of unnecessary taxis).



The three proper MAID subgames.

A subgame perfect equilibrium in a MAIM can rule out more non-credible threats.

Let D^1, D^2 , and J be binary variables, $J \sim \text{Bernoulli}(0.5)$, and $U^1 = D^1 D^2 - J(1 - D^2)$ and $U^2 = D^2(3 - D^1)$ be the utility functions for the two agents. There are three pure NE, but only the latter is a MAIM SPE:

- $D^1 = d$ always and $D^2 = a$ if and only if $D^1 = f$
- $D^1 = f$ always and $D^2 = a$ if and only if $D^1 = f$
- $D^1 = f$ always and $D^2 = a$ always

$D^2 = -a$ is always a non-credible threat because once the taxi has offered a price, the best response of the customer is to always accept the journey even at full price (if the customer observes $D^1 = f$ they will get expected utility 1 if they accept and 0 if they reject). This non-credible threat is ruled out by a subgame perfect equilibrium in a MAIM, but can't be ruled out in an EFG since there are no proper EFG subgames.

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