Translating Extensive Form Games to Open Games with Agency

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Game theory is the mathematical study of interaction among independent, self-interested agents.

- Essentials of Game Theory, Leyton-Brown and Shoham 2008

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e.g. economy and ecology, learning, control, etc. ~ *cybernetics*.

"Does all this have any practical applications?" It's really intriguing because this question is asked in almost exactly the same words wherever I go. [...]

I ask them, what do you think constitutes a practical application? [...] Roughly speaking, people converge within five to 10 minutes onto two categories of practical applications. One is, if you manage to make several million dollars instantly. The other is, if you manage to kill millions of people instantly. Many people are actually kind of shocked by their own answers.

- Tadashi Tokieda, from Quanta Magazine

Game theory shows cooperation is hard...

...hopefully better math facilities will make it easier!

Classical game theory: normal form and extensive form



Drawbacks:

- 1. Too little information (NF)... how is the game actually played?
- 2. Too much information (EF) ... exponential in the number of moves!
- 3. Unclear causal relationships (both).
- 4. Most importantly: non-compositional! (~> small scale)

Open games are a categorical framework for compositional game theory¹:



Advantages:

- 1. Detailed but not unwieldly ... compact notation and true causality
- 2. Compositional & diagrammatic (→ large scale).

¹Ghani, Hedges, Winschel, and Zahn 2018

Translating normal form games to open games is 'trivial'...



Translating extensive form games to open games is non-trivial:

- 1. We need to seriously consider the problem of agency:
 - 1. How do we represent correlated interests across a game?
 - 2. How do we represent player-dependent observational constraints?
- 2. We need adequate composition operators to reflect the structure of the game.

²Capucci, Gavranović, Hedges, and Rischel 2021

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To do so, we introduce:

- 1. **Open games with agency**, an improved compositional (and conceptual) framework for games, drawing from/inspiring 'open cybernetic systems'².
- 2. An operator calculus for games, in particular new choice operators.

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Open games with agency

What is a game?

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A game factors in two parts:

- 1. An arena, which models the dynamics of the game.
- 2. Some players, which intervene in the arena by making decisions.

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- 2. Some players, which intervene in the arena by making decisions.

A strategy $\omega \in \Omega_p$ for a player $1 \le p \le N$ is a policy p uses to make their decisions (e.g. a choice of move for each of p's rounds).

A strategy profile is a strategy for each player $\Omega = \Omega_1 \times \cdots \times \Omega_N$.

What is an arena?

An arena is an open system with three boundaries:



This is a parametrised lens $\mathcal{A}: (X, S) \xrightarrow{(\Omega, U)} (Y, R)$ specified by two maps

play : $\Omega \times X \to Y$, coplay : $\Omega \times X \times R \to \mho \times S$

What is an arena?

It can be 'closed' by specifying an initial state and a utility function:



Observe that $Lens(1,1)(X,S) \cong X$ and $Lens(Y,R)(1,1) \cong Y \rightarrow R$.

What is an arena?

A closed arena amounts to an evaluation of strategies with rewards:



What are players?

Players are a *distinct part* of the game (seen as a **system**) which expresses preferences by means of a **selection function**:

 $\varepsilon: (\Omega \to \mho) \longrightarrow \mathsf{P}\Omega$

In a single-player game, typically Ω is 'finite', $\overline{U} = \mathbb{R}$ and ε is argmax:

 $\operatorname{argmax}(u: \Omega \to \mathbb{R}) = \{\omega \in \Omega \, | \, \omega \text{ maximises } u\} \subseteq \Omega.$

A strategy profile is a Nash equilibrium

if no player has incentive to unilaterally change strategy.



Traditionally 'the' goal of game theory is determining Nash equilibria of games, though this is not necessarily the case anymore (see: Fudenberg and Levine 1998).

The assignment $\mathbb{S}(\Omega, \mathcal{O}) := (\Omega \to \mathcal{O}) \longrightarrow \mathsf{P}\Omega$ is functorial on Lens.

Crucially, S admits a lax monoidal structure we call Nash product:

$$\begin{split} &-\boxtimes -: \mathbb{S}(\Omega_1, \mho_1) \times \mathbb{S}(\Omega_2, \mho_2) \longrightarrow \mathbb{S}(\Omega_1 \times \Omega_2, \mho_1 \times \mho_2) \\ &(\varepsilon \boxtimes \eta)(u) = \{(\omega_1, \omega_2) \,|\, \omega_1 \in \varepsilon(u_1(-, \omega_2)) \text{ and } \omega_2 \in \eta(u_2(\omega_1, -))\} \end{split}$$

where $u = (u_1, u_2) : \Omega_1 \times \Omega_2 \rightarrow \mho_1 \times \mho_2$.

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Hence if we have players $P = \{1, ..., N\}$, each with preferences $\varepsilon_i \in \mathbb{S}(\Omega_i, \mho_i)$, we get:

 $\varepsilon_1 \boxtimes \cdots \boxtimes \varepsilon_N : (\Omega_1 \times \cdots \times \Omega_N \longrightarrow \mho_1 \times \cdots \times \mho_N) \longrightarrow \mathsf{P}(\Omega_1 \times \cdots \times \Omega_N)$

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The definition

Definition

An open game with agency is a pair

$$\mathsf{G} = (\mathcal{A}: (X,S) \xrightarrow{(\Omega,\mho)} (Y,R), \quad \varepsilon: \mathbb{S}(\Omega,\mho))$$

whose equilibria are given by

$$eq_{G}(x,k) = \varepsilon(x \, \Im \, \mathcal{A} \, \Im \, k).$$

In this way we recover the equilibrium predicate of open games (Ghani, Hedges, Winschel, and Zahn 2018).

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G has set of players P when

$$\Omega = \prod_{p \in P} \Omega_p, \quad \mho = \prod_{p \in P} \mho_p, \quad \varepsilon = \bigotimes_{p \in P} \varepsilon_p$$

in which case

$$eq_{\mathsf{G}}(x,k) = (\bigotimes_{p \in P} \varepsilon_p)(x \, \mathring{}\, \mathcal{A} \, \mathring{}\, k).$$

Composing games

Sequential composition



Parallel composition



Notice: these operators can be extended to games:

 $(\mathcal{A}_1,\varepsilon)\, \Im\, (\mathcal{A}_2,\eta):=(\mathcal{A}_1\, \Im\, \mathcal{A}_2,\varepsilon\boxtimes\eta), \quad (\mathcal{A}_1,\varepsilon)\otimes (\mathcal{A}_2,\eta):=(\mathcal{A}_1\otimes \mathcal{A}_2,\varepsilon\boxtimes\eta)$

Composing arenas

External choice



The 'environment' chooses which game to play, agents are prepared to play both. **Internal choice**



The 'environment' can play either game, agents choose which one.

Notice: these operators <u>can't</u> be extended to selection functions in a canonical way! (Actually \oplus <u>can</u> if we refine our typing judgments)

Reparametrisation

Most importantly arenas form a (locally fibred) **bicategory**: one can **reparametrise** along a lens $\alpha : (\Omega', \mho') \to (\Omega, \mho)$.



This is crucial for introducing agency!

Lenses in the blue direction represent 'players dynamics',

e.g. voting, observational constraints (imperfect information), rewards distribution (imputation), ...

If \mathcal{A} has set of players P and $r : P \to Q$ is a function, we can turn \mathcal{A} into an arena with players Q by reparametrising along the permutation of $\prod_{p \in P} \Omega_P$ induced by r:

 $\operatorname{regroup}_{r}: (\prod_{q \in Q} (r^*\Omega)_q, \prod_{q \in Q} (r^*\mho)_q) \longrightarrow (\prod_{p \in P} \Omega_p, \prod_{p \in P} \mho_p)$

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Example

If A_1 and A_2 have the same players $P = \{1, 2\}$, $A_1 \ ; A_2$ has players P + P. Regrouping along $\nabla : P + P \rightarrow P$ restores the correct set of players.



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Tying

By reparametrising along (Δ , combine) (where combine = +, π_2 , max, ...), we can enforce the same strategies to be played at different points of a game.

Example

Repeated games: play the same strategies at every round



Tying

By reparametrising along (Δ , combine) (where combine = +, π_2 , max, . . .), we can enforce the same strategies to be played at different points of a game.

Example

Repeated games: play the same strategies at every round



Notice: $(\Delta, \text{combine})^*(\mathcal{A}_1 \ ; \mathcal{A}_2)$ lies outside the image of $\ ;/\otimes/\oplus/\&$, hence introduces 'non-compositional' effects \rightsquigarrow **'agency is non-local'**.

Extensive form games & their translation

Extensive form



Extensive form



Definition

A (perfect information) extensive-form tree is a term of

data PETree = Leaf R^P | Node P $(n : \mathbb{N}^+)$ $([n] \to \mathsf{PETree})$

where P = set of players, R = type of rewards (usually \mathbb{R}).

Extensive form: strategies



Definition

```
strat<sub>PET</sub> : PETree \rightarrow P \rightarrow Set

strat<sub>PET</sub> (Leaf v) p = 1

strat<sub>PET</sub> (Node q n f) p

= (if p \equiv q then [n] else 1) × (\prod m \in [n]) strat<sub>PET</sub> (f m) p
```

Extensive form: moves





Definition

$$\begin{split} & \mathsf{path}_\mathsf{PET} : \mathsf{PETree} \to \mathsf{Set} \\ & \mathsf{path}_\mathsf{PET} \ (\mathsf{Leaf} \ v) = 1 \\ & \mathsf{path}_\mathsf{PET} \ (\mathsf{Node} \ p \ n \ f) = \\ & (\Sigma \ m \in [n]) \ \mathsf{path}_\mathsf{PET} \ (f \ m) \end{split}$$

Definition

 $\begin{aligned} \mathsf{payoff}_{\mathsf{PET}} &: (\mathcal{T} : \mathsf{PETree}) \to (\mathsf{path}_{\mathsf{PET}} \ \mathcal{T}) \to \mathcal{R}^{\mathcal{P}} \\ \mathsf{payoff}_{\mathsf{PET}} \ (\mathsf{Leaf} \ v) \bullet &= v \\ \mathsf{payoff}_{\mathsf{PET}} \ (\mathsf{Node} \ p \ n \ f) \ (m, \pi) \\ &= \mathsf{payoff}_{\mathsf{PET}} \ (f \ m) \ \pi \end{aligned}$

Translation

Finally, we can translate any PETree to an open game with agency:



and we equip this arena with $\boxtimes_{p \in P} \operatorname{argmax}(- \operatorname{\mathfrak{g}} \pi_p)$.

Imperfect information

Sometimes players can't access the whole state of the game (i.e. history of play)



Imperfect information

Access to information (or better, lack thereof) is represented by sets of 'indistinguishable states' called **information sets**:



Limit case: all information sets are singletons \equiv perfect information.

Imperfect information



Strategies need to respect information sets:

Players can't distinguish between nodes in the same set, so they play in the same way.

Adding imperfect information

Definition

An imperfect information extensive-form tree is a term of

data IETree = Leaf R^P | Node (i:I) $([n i] \rightarrow IETree)$

where

- 1. *I* : Set is a set of information labels,
- 2. $n: I \to \mathbb{N}^+$ assigns moves to nodes of the same information set and
- 3. there is a (surjective) map belongs : $I \rightarrow P$.

Translation

Idea: information sets are instances of 'tying':

1. Forget about information sets and recover a perfect information game:

IET-to-PET : IETree \rightarrow PETree IET-to-PET (Leaf v) = Leaf v IET-to-PET (Node *i* f) = Node (belongs *i*) (*n i*) (λm . IET-to-PET (f m))

- 2. Translate it using PET-to-Arena.
- 3. Reparametrise along clone which ties strategies in the same information sets.

 $\mathsf{IET-to-Arena}(T) = \mathsf{clone}^*(\mathsf{PET-to-Arena}(\mathsf{IET-to-PET} T))$

Example: Prisoner's Dilemma

44

IR



R

Example: Prisoner's Dilemma



Conclusions

In this work:

- 1. We have seen how games naturally decompose in *arenas* and *selection functions*, with *reparametrisations* playing a key role
- 2. This allows to handle long-range correlations in players' behaviour
- 3. Hence we can easily map extensive form trees to open games with agency

Future directions

There remain some open questions related to the EF \rightarrow OG translation:

- 1. Can we simplify the resulting game using topological moves? e.g. translating IEF often yields OG which are ⊗-decomposable
- 2. Can we treat subgame-perfect equilibrium?

Can Escardó-Oliva product of selections³ be a lax monoidal structure on \mathbb{S} ?

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- Can we simplify the resulting game using topological moves?
 e.g. translating IEF often yields OG which are ⊗-decomposable
- Can we treat subgame-perfect equilibrium?
 Can Escardó-Oliva product of selections³ be a lax monoidal structure on S?

Moreover, the framework of open games (with agency) is still incomplete.

- 1. Selection functions do not interact much with arenas Is there a better way to equip arenas with equilibrium predicates?
- 2. What kind of assignment is 'argmax : Arenas \rightarrow Games'? An oplax Para coalgebra?

³Escardó and Oliva 2015

Thanks for your attention!

Questions?

References I

K. Leyton-Brown and Y. Shoham, "Essentials of game theory: A concise multidisciplinary introduction", *Synthesis lectures on artificial intelligence and machine learning*, vol. 2, no. 1, pp. 1–88, 2008.



N. Ghani, J. Hedges, V. Winschel, and P. Zahn, "Compositional game theory", in *Proceedings of the 33rd Annual ACM/IEEE Symposium on Logic in Computer Science*, 2018, pp. 472–481.

M. Capucci, B. Gavranović, J. Hedges, and E. F. Rischel, "Towards foundations of categorical cybernetics", *arXiv preprint arXiv:2105.06332*, 2021.



D. Fudenberg and D. K. Levine, *The theory of learning in games*. MIT press, 1998, vol. 2.



M. Escardó and P. Oliva, "Bar recursion and products of selection functions", *The Journal of Symbolic Logic*, vol. 80, no. 1, pp. 1–28, 2015.