

Symbolic Computation of Sequential Equilibria

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- Extensive games with imperfect information.
- Standard solution concept: Sequential Equilibrium.
- No general solver available.

Introduction

Nash
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Sequential
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Consistency

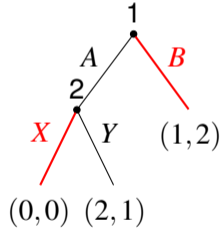
System of
Equations

Results

Nash equilibrium



No player can improve their expected utility by deviating.



Problem: Actions in unreached parts of the tree do not have to be optimal.

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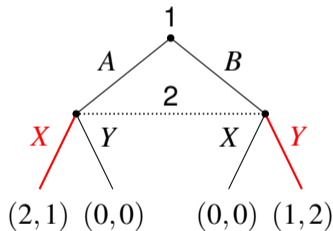
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Subgame perfect equilibrium



No player can improve their expected utility **in any subgame** by deviating.



Problem: Not suitable for games with imperfect information.

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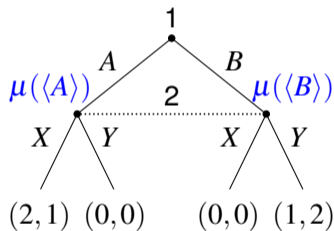
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Assessments consisting of a strategy profile β and system of beliefs μ .



Believed utility at information set I :

$$U_i^B(\beta, \mu | I) = \sum_{h \in I} \mu(I)(h) U_i(\beta | h)$$

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Sequential Equilibria [Kreps & Wilson 1982]

- **Sequential rationality**

No player can improve their believed payoff at any information set by deviating from the equilibrium strategy given their belief.

- **Consistency**

The players beliefs should be sensible given the played strategies.

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$$U_i^B(\beta', \mu | I) \leq U_i^B(\beta, \mu | I)$$

- Similar to subgame perfectness.
- Can be reduced to polynomial equations and inequalities.

$$U_i^B(\beta, \mu | I, a) - U_i^B(\beta, \mu | I) \leq 0$$

$$\beta(I)(a) \cdot (U_i^B(\beta, \mu | I, a) - U_i^B(\beta, \mu | I)) = 0$$

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- At information sets that are reached by playing β : Conditional probabilities.

$$\mu(I)(h) = P_{\beta}(h | I) = \frac{P_{\beta}(h)}{P_{\beta}(I)}$$

- But what if the information set is never reached?

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Consistency definition



There exists a series of assessments (β^n, μ^n) such that:

$$\beta^n(I)(a) > 0$$

$$\mu^n(I)(h) = \frac{P_{\beta^n}(h)}{P_{\beta^n}(I)}$$

$$\lim_{n \rightarrow \infty} (\beta^n, \mu^n) = (\beta, \mu)$$

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Examples of consistency



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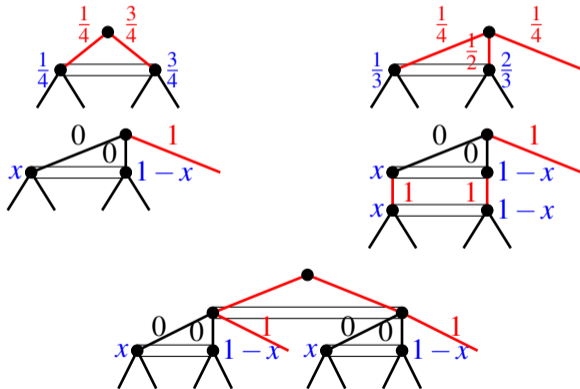
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Dealing with Consistency



- Working with consistency is difficult.
- Different characterization of consistency is required.
- Process to transform consistency to polynomial equations [Kohlberg & Reny, 1997].
- Involves the calculation of extreme directions of polyhedral cones.

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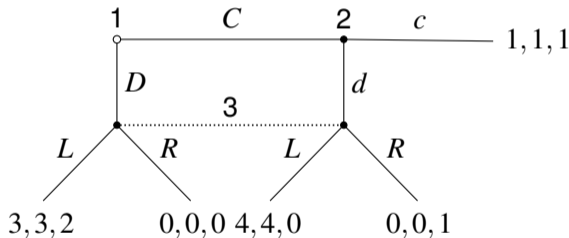
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Selten's horse



$$\mu(h_3)\beta(C)\beta(d) = \mu(h_4)\beta(D)$$

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System of Equations



- Sequential rationality as polynomial equations and inequalities.
 - Consistency as polynomial equations.
- ⇒ Single system of equations that describes all sequential equilibria of the game.

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Finding Solutions



- Algorithm: cylindrical algebraic decomposition (*Mathematica*)
- Compact representation of all solutions.

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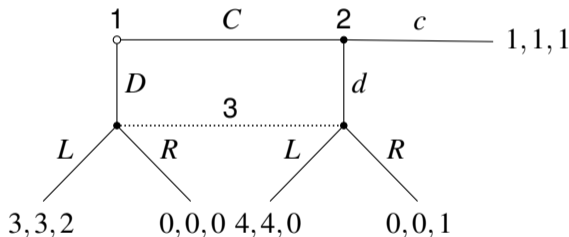
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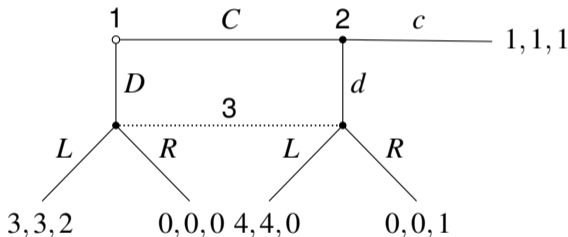
Selten's horse solutions



$$\begin{array}{llll}
 \beta(D) = 0 & \beta(d) = 0 & \beta(L) = 0 & 0 \leq \mu(\langle D \rangle) \leq \frac{1}{3} \\
 \beta(C) = 1 & \beta(c) = 1 & \beta(R) = 1 & \mu(\langle C, d \rangle) = 1 - \mu(\langle C \rangle)
 \end{array}$$

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Selten's horse solutions



$$\begin{array}{llll}
 \beta(D) = 0 & \beta(d) = 0 & 0 < \beta(L) \leq \frac{1}{4} & \mu(\langle D \rangle) = \frac{1}{3} \\
 \beta(C) = 1 & \beta(c) = 1 & \beta(R) = 1 - \beta(L) & \mu(\langle C, d \rangle) = \frac{2}{3}
 \end{array}$$

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Manipulating the system of equations



- Solve parameterized games by adding additional variables.
- Compute interesting subsets of equilibria.
- Reduce computation time by looking only for pure strategy equilibria.

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- Single system of polynomial equations and inequalities that describes all sequential equilibria of the game.
- Implemented a general solver for sequential equilibria.
- Integrated into *Game Theory Explorer*.
- Computational complexity double exponential in number of variables.
- Small examples are feasible.

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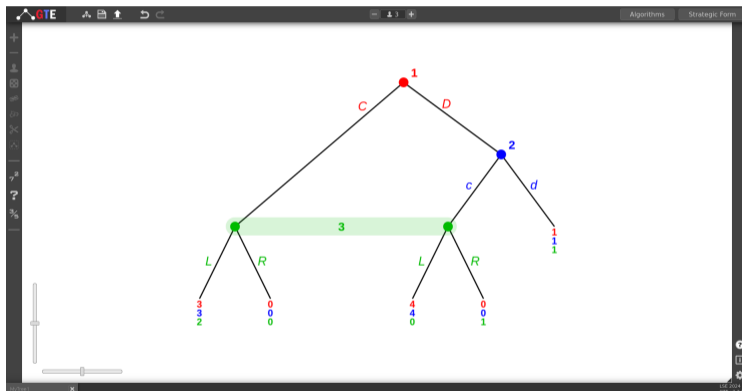
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Game Theory Explorer



Try out yourself at gte.engesser.xyz
github.com/tengesser/GTE-sequential

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