# Common Belief in Rationality in Psychological Games 

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## Introduction

■ So far preferences over choices only depended on first-order beliefs wrt opponent behavior.

■ This lecture: What if players care about opponent behavior and beliefs?
■ Two examples with second-order beliefs:

- If aiming to meet opponent's expectations (aka guilt aversion) you prefer a choice to the extent that you believe the opponent expects you to make that choice.
- If aiming to surprise opponent you prefer a choice to the extent that you believe the opponent expects you to not make that choice.

■ Notes:

- Here, guilt/surprise emerge as reflections wrt (not) matching expectations. Such insights make psychological game useful.
- No new tools needed here. Instead, different notion of optimal choice leads to more complex setting.


## Introductory Example

Surprising Barbara, baseline decision problem

- You and Barbara are invited to a party. Each of you simultaneously choose from dress colors blue, green, red.

■ Personally, you prefer blue to green to red. In addition, you seek to wear different color than Barbara.

■ Same for Barbara with color preference red to blue to green.

| You | blue | green | red |  | Barbara | blue | green | red |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| blue | 0 | 3 | 3 |  | blue | 0 | 2 | 2 |
| green | 2 | 0 | 2 |  | green | 1 | 0 | 1 |
| red | 1 | 1 | 0 |  | red | 3 | 3 | 0 |

## Introductory Example

Surprising Barbara, surprise utilities
■ Additionally, you seek to surprise Barbara, deriving additional utility for surprising choices proportional to your color preference. Same is true for Barbara.

|  |  |  |  | Barbara expects |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| You expect |  |  |  |  |  |  |  |  |
| You | blue | green | red |  | Barbara | blue | green | red |
| blue | 0 | 3 | 3 |  | blue | 0 | 2 | 2 |
| green | 2 | 0 | 2 |  | green | 1 | 0 | 1 |
| red | 1 | 1 | 0 |  | red | 3 | 3 | 0 |

## Introductory Example

Surprising Barbara, full decision problem
■ Finally, suppose your overall utility is the sum of your baseline and surprise utilities.

■ This yields decision problem with choice-belief combinations replacing choices for opponent.

| You | $(b, b)$ | $(b, g)$ | $(b, r)$ | $(g, b)$ | $(g, g)$ | $(g, r)$ | $(r, b)$ | $(r, g)$ | $(r, r)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| blue | 0 | 3 | 3 | 3 | 6 | 6 | 3 | 6 | 6 |
| green | 4 | 2 | 4 | 2 | 0 | 2 | 4 | 2 | 4 |
| red | 2 | 2 | 1 | 2 | 2 | 1 | 1 | 1 | 0 |


| Barbara | $(b, b)$ | $(b, g)$ | $(b, r)$ | $(g, b)$ | $(g, g)$ | $(g, r)$ | $(r, b)$ | $(r, g)$ | $(r, r)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| blue | 0 | 2 | 2 | 2 | 4 | 4 | 2 | 4 | 4 |
| green | 2 | 1 | 2 | 1 | 0 | 1 | 2 | 1 | 2 |
| red | 6 | 6 | 3 | 6 | 6 | 3 | 3 | 3 | 0 |

## Introductory Example: Expected Utility

How to calculate utility at a second-order belief? Take following example:


■ You believe w. 0.2: Barbara chooses blue and believes you choose blue. $\Rightarrow$ State ( $b, b$ ) in decision problem.

■ Similarly, you assign $0.8 \cdot 0.5=0.4$ each to states $(r, g)$ and $(r, r)$.
■ Then, for example, choosing blue yields expected utility $0.2 \cdot 0+0.4 \cdot 6+0.4 \cdot 6=4.8$.

## Introductory Example: Rationality

| You | $(b, b)$ | $(b, g)$ | $(b, r)$ | $(g, b)$ | $(g, g)$ | $(g, r)$ | $(r, b)$ | $(r, g)$ | $(r, r)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| blue | 0 | 3 | 3 | 3 | 6 | 6 | 3 | 6 | 6 |
| green | 4 | 2 | 4 | 2 | 0 | 2 | 4 | 2 | 4 |
| red | 2 | 2 | 1 | 2 | 2 | 1 | 1 | 1 | 0 |
| Barbara | $(b, b)$ | $(b, g)$ | $(b, r)$ | $(g, b)$ | $(g, g)$ | $(g, r)$ | $(r, b)$ | $(r, g)$ | $(r, r)$ |
| blue | 0 | 2 | 2 | 2 | 4 | 4 | 2 | 4 | 4 |
| green | 2 | 1 | 2 | 1 | 0 | 1 | 2 | 1 | 2 |
| red | 6 | 6 | 3 | 6 | 6 | 3 | 3 | 3 | 0 |

■ Your choice red is strictly dominated by (e.g.) $0.4 \cdot$ blue $+0.6 \cdot$ green.Similarly, green strictly dominated for Barbara by (e.g.) $0.4 \cdot$ red $+0.6 \cdot$ blue .

■ Hence, no second-order belief makes these choices optimal for you and Barbara. $\Rightarrow$ irrational

## Introductory Example: Rationality

Remaining choices blue and green rational for you:


■ blue strictly optimal if you believe Barbara chooses blue and believes you choose green (state $(b, g)$ ). Similar for green at $(r, b)$.
■ Also, blue is optimal for Barbara at $(g, r)$ and red is optimal for her at $(b, b)$.
$\Rightarrow$ Common belief in rationality.
■ Note: Both can choose at least 2 colors, so surprise possible at CBR.

## Agenda

■ Psychological Games and Common Belief in Rationality

■ Procedural Characterization

- Possibility

■ Variants of the Procedure

## Second-Order Expectations

## Definition

A second-order expectation for player $i$ is a probability distribution $e_{i} \in \Delta\left(C_{i} \times C_{j}\right)$.

- Second-order expectations concern events of form "player $j$ chooses $c_{j}$ and believes player $i$ chooses $c_{i}$ " $\left(\hat{=} e_{i}\left(c_{j}, c_{i}\right)\right)$.
■ Formally, every second-order belief $b_{i}^{2} \in \Delta\left(C_{j} \times \Delta\left(C_{i}\right)\right)$ induces a second-order expectation $e_{i}$ via

$$
e_{i}\left(c_{j}, c_{i}\right)=b_{i}^{1}\left(c_{j}\right) \int_{\Delta\left(C_{i}\right)} b_{j}^{1}\left(c_{i}^{\prime}\right) \mathrm{d} b_{i}^{2}\left(\mid c_{j}\right),
$$

where $b_{i}^{2}\left(E \mid c_{j}\right)=b_{i}^{2}\left(\left\{c_{j}\right\} \times E\right) / b_{i}^{2}\left(\left\{c_{j}\right\} \times \Delta\left(C_{i}\right)\right)$ for every $E \subseteq \Delta\left(C_{i}\right)$.

## (Linear) Psychological Games (of Order 2)

## Definition

A psychological game with two players specifies
a) finite set of choices $C_{i}$ for both players $i$,
b) utility function $u_{i}: C_{i} \times \Delta\left(C_{j} \times C_{i}\right) \rightarrow \mathbb{R}$ for both players $i$, where

$$
u_{i}\left(c_{i}, e_{i}\right)=\sum_{\left(c_{j}, c_{i}^{\prime}\right) \in C_{j} \times C_{i}} e_{i}\left(c_{j}, c_{i}\right) u_{i}\left(c_{i},\left(c_{j}, c_{i}^{\prime}\right)\right)
$$

## Notes:

■ $u_{i}$ generalizes standard expected utility using expectations.
■ Assumptions: (i) $u_{i}$ depends on second-order beliefs only,
(ii) $u_{i}$ is linear in up to level-2 uncertainty.
$\Rightarrow$ Decision problems with set of states $C_{j} \times C_{i}$ iso $C_{j}$.
■ General psychological games: $u_{i}$ non-linear in full belief hierarchy.

## Linearity in up to Second-Order Uncertainty

Reconsider introductory example:


■ Both second-order beliefs above induce the same expectation $e_{i}=0.2 \cdot(b, b)+0.4 \cdot(r, g)+0.4 \cdot(r, r)$.

■ Intuitively, it does not matter whether uncertainty emanates at level 1 (other's behavior) or level 2 (other's beliefs about behavior).

## Epistemic Model for Introductory Example

■ Types: $T_{1}=\left\{t_{1}^{\text {blue }}, t_{1}^{\text {green }}\right\}, T_{2}=\left\{t_{2}^{\text {blue }}, t_{2}^{\text {red }}\right\}$
■ Beliefs for You: $b_{1}\left(t_{1}^{\text {blue }}\right)=0.8 \cdot\left(\right.$ blue,$\left.t_{2}^{\text {blue }}\right)+0.2 \cdot\left(\right.$ red,$\left.t_{2}^{\text {red }}\right)$,

$$
b_{1}\left(t_{1}^{\text {green }}\right)=\left(\text { red }, t_{2}^{\text {red }}\right) .
$$

■ Beliefs for Barbara: $b_{2}\left(t_{2}^{\text {blue }}\right)=\left(\right.$ green,$\left.t_{1}^{\text {green }}\right)$,

$$
b_{2}\left(t_{2}^{\text {red }}\right)=0.9 \cdot\left(\text { blue, } t_{1}^{\text {blue }}\right)+0.1 \cdot\left({\text { green } \left., t_{1}^{\text {green }}\right) . ~}_{\text {and }}\right.
$$

## Types, Optimal and Rational Choices

■ Consider epistemic models like in Chapter 3, but now possibly with infinitely many types.

■ Main change in psychological games: optimality is wrt exectations.

## Definition

Take type $t_{i}$ with expectation $e_{i}$. Choice $c_{i} \in C_{i}$ is optimal for $t_{i}$ if

$$
u_{i}\left(c_{i}, t_{i}\right)=u_{i}\left(c_{i}, e_{i}\right)=\sum_{\left(c_{j}, c_{i}^{\prime}\right) \in C_{j} \times C_{i}} e_{i}\left(c_{j}, c_{i}^{\prime}\right) u_{i}\left(c_{i},\left(c_{j}, c_{i}^{\prime}\right)\right) \geq u_{i}\left(c_{i}^{\prime \prime}, e_{i}\right)
$$

for all $c_{i}^{\prime \prime} \in C_{i}$.

## (Common) Belief in Rationality

Up to $k$-fold/common belief in rationality now defined like in standard game:

## Definition

Type $t_{i}$,

- believes in the opponents' rationality if $b_{i}\left(t_{i}\right)$ only deems possible $\left(c_{j}, t_{j}\right)$ where $c_{j}$ is optimal for $t_{j}$,
- expresses up to $k$-fold belief in rationality for $k \geq 1$ if $b_{i}\left(t_{i}\right)$ only deems possible $\left(c_{j}, t_{j}\right)$ where $c_{j}$ is optimal for $t_{j}$ expressing up to ( $k-1$ )-fold belief in rationality,
- expresses common belief in rationality if $b_{i}\left(t_{i}\right)$ expresses up to $k$-fold belief in rationality for all $k \geq 1$.


## Agenda

■ Psychological Games and Common Belief in Rationality

■ Procedural Characterization

■ Possibility

■ Variants of the Procedure

## Towards an Iterative Procedure

- To find all choices consistent with common belief in rationality, we generalize iterated strict dominance.

■ As seen in following example, eliminating strictly dominated choices and corresponding (standard) states in decision problems is not enough.

■ More surprisingly, also eliminating choices and full states (deterministic second-order expectations) is not enough.

## Example: "Black and White Dinner with a Twist"

■ You and Barbara go to a dinner an simultaneously choose from dress colors black and white.
■ Personally, you prefer white to black. However, to the degree that you believe Barbara wears white and expects you to wear white, you slightly prefer black.

■ Barbara's preferences are the same with black and white reversed.

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ |  | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 3 |  | black | 2 | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 |  | white | 3 | 0 | 0 | 0 |

- Note that no choice is strictly dominated for you or Barbara!


## "Black and White Dinner with a Twist": Rationality

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ |  | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | black | 0 | 0 | 0 | 3 |  | black | $\left.w_{2}\right)$ |  |
| white | 2 | 2 | 2 | 2 |  | white | 3 | 2 | 2 |
| 2 | 0 | 0 | 0 |  |  |  |  |  |  |

■ Even though no strategy is dominated, we are not done yet.
■ Why?

- Utilities depend on second-order expectations.
- Hence, need to track choices and first-order beliefs.

■ black rational for you iff $e_{1}\left(w_{2}, w_{1}\right) \geq 2 / 3$.
■ Similarly, white rational for Barbara iff $e_{2}\left(b_{1}, b_{2}\right) \geq 2 / 3$.

## "Blk and Wt Dinner w Twist": Belief in Rationality

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ |  | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 3 |  | black | 2 | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 |  | white | 3 | 0 | 0 | 0 |

■ How does belief in rationality affect states you deem possible?

- For Barbara to rationally play white, need $b_{2}^{1}\left(b_{1}\right) \geq \frac{2}{3}$. (If not, could never have $e_{2}\left(b_{1}, b_{2}\right) \geq \frac{2}{3}$.)
- But then, using Bayes' rule, belief in Barbara's rationality implies $e_{1}\left(w_{1} \mid w_{2}\right)=\frac{e_{1}\left(w_{2}, w_{1}\right)}{e_{1}\left(w_{2}, b_{1}\right)+e_{1}\left(w_{2}, w_{1}\right)} \leq \frac{1 / 3}{2 / 3+1 / 3}=1 / 3$.
$\Rightarrow$ Conditional on Barbara rationally choosing $w_{2}$, you must believe Barbara assigns at most $1 / 3$ to your choice $w_{1}$.

■ Similarly, belief in rationality implies $e_{2}\left(b_{1} \mid b_{2}\right) \leq 1 / 3$ for Barbara.

## "Blk and Wt Dinner w Twist": Belief in Rationality

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ |  | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $\left(w_{1}, w_{2}\right)$ |  |  |  |  |  |  |  |  |
| black | 0 | 0 | 0 | 3 |  | black | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 |  | white | 3 | 0 | 0 |

■ But then, black is not rational for you under belief in rationality! Why?

- Rationality of black for you requires $e_{1}\left(w_{2}, w_{1}\right) \geq 2 / 3$
- Belief in Barbara's rationality requires $e_{1}\left(w_{1} \mid w_{2}\right) \leq 1 / 3$.
- The latter implies $e_{1}\left(w_{2}, w_{1}\right)=b_{1}^{1}\left(w_{2}\right)\left[e_{1}\left(w_{1} \mid w_{2}\right)\right] \leq 1 / 3$.
$\Rightarrow \perp$.
■ Similarly, white is not rational for Barbara under belief in rationality.


## "Blk and Wt Dinner w Twist": Belief in Rationality

- Clearly, cannot capture reasoning using strict dominance and elimination of standard states.

■ However, also no full state among $\left(b_{2}, b_{1}\right),\left(b_{2}, w_{1}\right),\left(w_{2}, w_{1}\right),\left(w_{1}, w_{2}\right)$ can be eliminated here (and similarly for Barbara).

■ Why? Barbara's rational choice white puts probabilistic upper bound $1 / 3$ on her belief in $w_{1}$ (and analogously for you).

■ Hence, correct decision problems for belief in rationality:

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, 2 / 3 \cdot b_{1}+1 / 3 \cdot w_{1}\right)$ |  | Barbara | $\left(b_{1}, 2 / 3 \cdot w_{2}+1 / 3 \cdot b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 1 | black | 2 | 2 | 2 | 2 |  |
| white | 2 | 2 | 2 | 2 |  | white | 1 | 0 | 0 | 0 |

## "Blk and Wt Dinner w Twist": CBR

■ Eliminating black for you and white for Barbara (and one more round of eliminating states) yields:

| You | $\left(b_{2}, w_{1}\right)$ | Barbara | $\left(w_{1}, b_{2}\right)$ |
| :---: | :---: | :---: | :---: |
| white | 2 |  | black |

$\Rightarrow$ white for you and black for Barbara uniquely rational under CBR.

## Elimination of Second-Order Expectations

■ Crucial step in example: Eliminate $e_{i}$ inconsistent w. $j$ 's rationality.
■ More generally, following recipe:

1) For every undominated $c_{j}$, find expectations $E_{j}\left(c_{j}\right)$ making $c_{j}$ optimal.
2) Let $B_{j}\left(c_{j}\right)=\left\{b_{j} \in \Delta\left(C_{j}\right) \mid b_{j}=\operatorname{marg}_{C_{j}} e_{j}\right.$ for some $\left.e_{j} \in E_{j}\left(c_{j}\right)\right\}$ be corresponding first-order beliefs.
3) Then, conditional on $c_{j}$, $i$ must believe $j$ 's first-order belief is in $B_{j}\left(c_{j}\right)$. Formally, $e_{i}\left(\mid c_{j}\right) \in B_{j}\left(c_{j}\right)$, where

$$
e_{i}\left(c_{i} \mid c_{j}\right)=\frac{e_{i}\left(c_{j}, c_{i}\right)}{\sum_{c_{i}^{\prime} \in C_{i}} e_{i}\left(c_{j}, c_{i}^{\prime}\right)} \text { for all } c_{i} \in C_{i} .
$$

■ Notes:

- Let $E_{i}$ be $i$ 's expectations satisfying (3). $E_{i}$ is convex combination of finitely many extreme $e_{i} \in \Delta\left(C_{j} \times C_{i}\right)$.
- Repeat steps above for $e_{i}$ (in)consistent w. up to $k$-fold belief in rationality, $k>1$.


## "BIk and Wt Dinner w Twist": Eliminating Second-Order Expectations



■ Tetrahedron: $\Delta\left(C_{j} \times C_{i}\right)$-probability simplex.
■ Solid triangle: Indifference hyperplane for choices black and white.
■ Dotted triangle and below: Expectations consistent with belief in rationality.

## It. Elim. of Choices and Second-Order Expectations

## Definition

Round 1. For both players $i$, eliminate all strictly dominated choices. For all other $c_{i}$, let $E_{i}^{1}\left(c_{i}\right)$ be supporting expectations.
Round $k \geq 1$. For each player $i$ and opp. choice $c_{j}$, let $B_{j}^{k-1}\left(c_{j}\right)$ be first-order beliefs induced by $E_{j}^{k-1}\left(c_{j}\right)$, and let $E_{i}^{k}$ be $i$ 's expectations s.th. $e_{i}\left(\mid c_{j}\right) \in B_{j}^{k-1}\left(c_{j}\right)$ f. all $c_{j}$ deemed possible by $e_{i}$. Eliminate all choices $c_{i}$ that are not optimal for any $e_{i} \in E_{i}^{k}$. For all other $c_{i}$, let $E_{i}^{k}\left(c_{i}\right)$ be supporting expectations.
Proceed until no more choices/expectations can be eliminated.

## Theorem

For any $k \geq 1$, choice $c_{i}$ is rational for player $i$ under up to $k$-fold (common) belief in rationality iff $c_{i}$ survives $(k+1)$-fold (iterated) elimination of choices and expectations.

## Example: "Dinner w Strong Preference f Surprise"

- You and Barbara go to a dinner an simultaneously choose from dress colors black and white.

■ Your preferences are the same as before, except each of you more strongly prefers your less liked choice if you mismatch with your opponent and surprise them as well.

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ |  | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 5 |  | black | 2 | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 |  | white | 5 | 0 | 0 | 0 |

- We use iterated elimination of choices and expectations to find choices consistent with common belief in rationality.


## "Dinner w Str Pref f Surprise": Rationality

■ As before, no choices strictly dominated.

- black rational for you iff $e_{1}\left(w_{2}, w_{1}\right) \geq 2 / 5$ and white rational for Barbara iff $e_{1}\left(b_{2}, b_{1}\right) \geq 2 / 5$.
your conditional preference relation


Barbara's conditional preference relation


## "Dinner w Str Pref f Surprise": Belief in Rationality

$\square$ With belief in rationality, must have $e_{1}\left(w_{1} \mid w_{2}\right) \leq 3 / 5$. Hence, state $\left(w_{2}, w_{1}\right)$ in your decision problem replaced by $2 / 5 \cdot\left(w_{2}, b_{1}\right)+3 / 5 \cdot\left(w_{2}, w_{1}\right)$.

■ Similarly, state $\left(b_{1}, b_{2}\right)$ in Barbara's decision problem replaced by $2 / 5 \cdot\left(b_{1}, w_{2}\right)+3 / 5 \cdot\left(b_{1}, b_{2}\right)$.
your conditional preference relation


Barbara's conditional preference relation


■ As seen in the figure, no choices are eliminated at belief in rationality.

## "Dinner w Str Pref f Surprise": Belief in Rationality

■ Decision problems after 2-fold elimination of choices and expectations:

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, 2 / 5 \cdot b_{1}+3 / 5 \cdot w_{1}\right)$ |  | Barbara | $\left(b_{1}, 2 / 5 \cdot w_{2}+3 / 5 \cdot b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 3 | black | 2 | 2 | 2 | 2 |  |
| white | 2 | 2 | 2 | 2 |  | white | 3 | 0 | 0 | 0 |

- As follows from the table, black rational for you under belief in rationality iff $e_{1}\left(w_{2}, 2 / 5 \cdot b_{1}+3 / 5 \cdot w_{1}\right) \geq 2 / 3$.

■ Analogously, white rational for Barbara under belief in rationality iff $e_{2}\left(b_{1}, 2 / 5 \cdot w_{2}+3 / 5 \cdot b_{2}\right) \geq 2 / 3$.

## "Dinner w Str Pref f Surp": Up to 2-Fold Bel in Rat

■ With up to 2 -fold belief in rationality (given new extreme state), must now have $e_{1}\left(w_{1} \mid w_{2}\right) \leq 1 / 3$. Hence, state $2 / 5 \cdot\left(w_{2}, b_{1}\right)+3 / 5 \cdot\left(w_{2}, w_{1}\right)$ in your decision problem replaced by $2 / 3 \cdot\left(w_{2}, b_{1}\right)+1 / 3 \cdot\left(w_{2}, w_{1}\right)$.

■ Similarly, state $2 / 5 \cdot\left(b_{1}, w_{2}\right)+3 / 5 \cdot\left(b_{1}, b_{2}\right)$ in Barbara's decision problem replaced by $2 / 3 \cdot\left(b_{1}, w_{2}\right)+1 / 3 \cdot\left(b_{1}, b_{2}\right)$.


- As seen in figure, black eliminated for you and white for Barbara.


## "Dinner w Str Pref f Surp": Common Belief in Rat

■ Decision problems after 3-fold elimination of choices and expectations:

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, 2 / 3 \cdot b_{1}+1 / 3 \cdot w_{1}\right)$ |  | Barbara | $\left(b_{1}, 2 / 3 \cdot w_{2}+1 / 3 \cdot b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 1 | black | 2 | 2 | 2 | 2 |  |
| white | 2 | 2 | 2 | 2 |  | white | 1 | 0 | 0 | 0 |

- With 4-fold elimination of choices and expectations, states involving $w_{2}$ are eliminated for you and states involving $b_{1}$ are eliminated for Barbara.
- Then, with 5 -fold elimination of choices and expectations, state $\left(b_{2}, b_{1}\right)$ is eliminated for you and state $\left(w_{1}, w_{2}\right)$ is eliminated for Barbara.
- Beliefs diagram for CBR:

$$
\begin{array}{ccc}
\text { You } & \text { Barbara } & \text { You } \\
\text { white } \longrightarrow \text { black } \longrightarrow \text { white }
\end{array}
$$

## Example: "Dinner w Huge Preference f Surprise"

■ Different from previous procedures, elimination of choices and expectations is not finite, even with finitely many choices for both players.
■ This is seen in following variation of previous examples:

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, w_{1}\right)$ | Barbara | $\left(b_{1}, b_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 8 | black | 2 | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 | white | 8 | 0 | 0 | 0 |

■ We use iterated elimination of choices and expectations to find choices consistent with common belief in rationality.

## "Dinner w Huge Pref f Surprise": Rationality

■ Again, no choices strictly dominated.

- black rational for you iff $e_{1}\left(w_{2}, w_{1}\right) \geq 1 / 4$ and white rational for Barbara iff $e_{1}\left(b_{2}, b_{1}\right) \geq 1 / 4$.
your conditional preference relation


Barbara's conditional preference relation


## "Dinner w Huge Pref f Surp": Belief in Rationality

$\square$ With belief in rationality, must have $e_{1}\left(w_{1} \mid w_{2}\right) \leq 3 / 4$. Hence, state $\left(w_{2}, w_{1}\right)$ in your decision problem replaced by $1 / 4 \cdot\left(w_{2}, b_{1}\right)+3 / 4 \cdot\left(w_{2}, w_{1}\right)$.

■ Similarly, $1 / 4 \cdot\left(b_{1}, w_{2}\right)+3 / 4 \cdot\left(b_{1}, b_{2}\right)$ replaces $\left(b_{1}, b_{2}\right)$ for Barbara.
your conditional preference relation


Barbara's conditional preference relation


■ As seen in figure, more expectations supporting black for you and white for Barbara survive initial restrictions.

## "Dinner w Huge Pref f Surp": Common Bel in Rat

■ It turns out that some beliefs supporting black for you and white for Barbara are never eliminated.

■ To see this write $\left(1-e^{k-1}\right)$ for maximum weight on $\left(w_{2}, w_{1}\right) /\left(b_{1}, b_{2}\right)$ after round $k-1$ and consider reduced decision problems at round $k$ :

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2},\left(1-e^{k-1}\right) \cdot w_{1}+e^{k-1} \cdot b_{1}\right)$ |  | Barbara | $\left(b_{1},\left(1-e^{k-1}\right) \cdot b_{2}+e^{k-1} \cdot w_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 |  | black | 2 | 2 | 2 | 2 |  |
| white | 2 | 2 | 2 | $\left(1-e^{k-1}\right) 8$ |  | white | $\left(1-e^{k-1}\right) 8$ | 0 | 0 | 0 |

■ New minimum weight $e^{k}$ on $\left(w_{2}, w_{1}\right) /\left(b_{1}, b_{2}\right)$ solves $e^{k} \geq \frac{2}{8\left(1-e^{k-1}\right)}$.
■ $e^{k} \neq e^{k-1}$ for any finite $k$.
■ Furthermore, at common belief in rationality/iterated elimination of choices and expectations, one has $e^{k}=e^{k-1}=1 / 2$.

## "Dinner w Huge Pref f Surp": Common Bel in Rat

■ Reduced decision problems after countably many rounds:

| You | $\left(b_{2}, b_{1}\right)$ | $\left(b_{2}, w_{1}\right)$ | $\left(w_{2}, b_{1}\right)$ | $\left(w_{2}, 1 / 2 \cdot w_{1}+1 / 2 \cdot b_{1}\right)$ |  | Barbara | $\left(b_{1}, 1 / 2 \cdot b_{2}+1 / 2 \cdot w_{2}\right)$ | $\left(b_{1}, w_{2}\right)$ | $\left(w_{1}, b_{2}\right)$ | $\left(w_{1}, w_{2}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| black | 0 | 0 | 0 | 4 |  | black | 2 | 2 | 2 | 2 |
| white | 2 | 2 | 2 | 2 |  | white | 4 | 0 | 0 | 0 |

■ Expectations consistent with CBR:


## "Dinner w Huge Pref f Surp": Beliefs Diagram



## Agenda

■ Psychological Games and Common Belief in Rationality

■ Procedural Characterization

■ Possibility

■ Variants of the Procedure

## Possibility of Common Belief in Rationality

■ An important question is whether psychological games as defined here are always consistent with common belief in rationality.

■ In other words, for any such game $\Gamma$, can we find a model $M^{\Gamma}$ such that some type $t_{i}$ for every $i$ expresses common belief in rationality?

- The answer is non-obvious in view of the procedure's countable length (see previous example).


## Possibility of Common Belief in Rationality

■ Using that $E_{i}^{k}$ is a convex polytope for both players $i$ and any $k$, standard techniques (Cantor's intersection theorem) imply that $\bigcap_{k \geq 1} E^{k}$ is non-empty for both players.

■ For similar reasons, any choice elimination must occur within finite steps.
■ However, between two consecutive choice eliminations, the procedure may take any finite number of steps.

■ Note:
■ General psychological games can feature both non-existence and eliminations after countable steps.
■ Linearity ensures all choice eliminations are after finite steps.
Dependence of $u_{i}$ on finite orders of beliefs ensures existence. Both conditions can be weakened.

## Agenda

■ Psychological Games and Common Belief in Rationality

■ Procedural Characterization

■ Possibility

■ Variants of the Procedure

## Order Independence

■ Similar to standard iterated strict dominance, iterated elimination of choices and expectations is order-independent.

- Intuitively, this is true for two reasons:

1) If a choice is strictly dominated in a decision problem, it is also strictly dominated in any reduced version of that problem.
2) If an expectation is not eliminated a some step, it can still be eliminated at a later step.

■ As a consequence, we can start off eliminating strictly dominated choices and probability-one second-order expectations and then apply the full procedure to the simplified problem.

■ Caution: Correct intermediate outputs ( $k$-fold elim of chs and exps, $k \geq 1$ ) only found when eliminating full-speed in the original order.

## States-First Procedure

The following procedure is output-equivalent to the original one:

## Definition

Round 1. For both players $i$, eliminate all strictly dominated choices.
Round $k \geq 1$. For each player i's decision problem, eliminate all states $\left(c_{j}, c_{i}\right)$ such that either choice has been eliminated for the respective player at the previous round. In the reduced problem, eliminate all strictly dominated choices.
Proceed until no more choices/states can be eliminated. Subsequently perform elimination of choices and expectations.

## Theorem

The states-first procedure always yields the same final output as iterated elimination of choices and expectations.

## Example: "Exceeding Barbara's Expectations"

- You and Barbara record a song together, each practicing 1,3,5, or 7 weeks.
- Investing $w_{i}$ weeks costs $w_{i}^{2}$ for both players $i$.

■ Direct benefits of practice are given by $w_{i} \cdot w_{j}$ with own investment $w_{i}$ and opponent investment $w_{j}$.
Additionally, each of you wants to exceed other's expectations $w_{i}^{\prime}$, giving you added benefit of $\left(w_{i}-w_{i}^{\prime}\right)$ for $w_{i}>w_{i}^{\prime}$.
■ Utility functions: $u_{i}\left(w_{i},\left(w_{j}, w_{i}^{\prime}\right)\right)=\left\{\begin{array}{l}w_{i} \cdot w_{j}-w_{i}^{2}+\left(w_{i}-w_{i}^{\prime}\right), \text { if } w_{i}>w_{i}^{\prime}, \\ w_{i} \cdot w_{j}-w_{i}^{2}, \text { otherwise } .\end{array}\right.$

| You/Barbara | $(1,1)$ | $(1,3)$ | $(1,5)$ | $(1,7)$ | $(3,1)$ | $(3,3)$ | $(3,5)$ | $(3,7)$ | $(5,1)$ | $(5,3)$ | $(5,5)$ | $(5,7)$ | $(7,1)$ | $(7,3)$ | $(7,5)$ | $(7,7)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 0 | 0 | 2 | 2 | 2 | 2 | 4 | 4 | 4 | 4 | 6 | 6 | 6 | 6 |
| 3 | -4 | -6 | -6 | -6 | 2 | 0 | 0 | 0 | 8 | 6 | 6 | 6 | 14 | 12 | 12 | 12 |
| 5 | -16 | -18 | -20 | -20 | -6 | -8 | -10 | -10 | 4 | 2 | 0 | 0 | 14 | 12 | 10 | 10 |
| 7 | -36 | -38 | -40 | -42 | -22 | -24 | -26 | -28 | -8 | -10 | -12 | -14 | 6 | 4 | 2 | 0 |

■ We use states-first procedure to find choices consistent with common belief in rationality.

## "Exceeding Barbara's Expectations": Rationality

| You/Barbara | $(1,1)$ | $(1,3)$ | $(1,5)$ | $(1,7)$ | $(3,1)$ | $(3,3)$ | $(3,5)$ | $(3,7)$ | $(5,1)$ | $(5,3)$ | $(5,5)$ | $(5,7)$ | $(7,1)$ | $(7,3)$ | $(7,5)$ | $(7,7)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 0 | 0 | 2 | 2 | 2 | 2 | 4 | 4 | 4 | 4 | 6 | 6 | 6 | 6 |
| 3 | -4 | -6 | -6 | -6 | 2 | 0 | 0 | 0 | 8 | 6 | 6 | 6 | 14 | 12 | 12 | 12 |
| 5 | -16 | -18 | -20 | -20 | -6 | -8 | -10 | -10 | 4 | 2 | 0 | 0 | 14 | 12 | 10 | 10 |
| 7 | -36 | -38 | -40 | -42 | -22 | -24 | -26 | -28 | -8 | -10 | -12 | -14 | 6 | 4 | 2 | 0 |

■ 7 strictly dominated by 5 for you and Barbara.

## "Exceeding Barbara's Exp": States-First Proc Rd 2

| You/Barbara | $(1,1)$ | $(1,3)$ | $(1,5)$ | $(3,1)$ | $(3,3)$ | $(3,5)$ | $(5,1)$ | $(5,3)$ | $(5,5)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 0 | 2 | 2 | 2 | 4 | 4 | 4 |
| 3 | -4 | -6 | -6 | 2 | 0 | 0 | 8 | 6 | 6 |
| 5 | -16 | -18 | -20 | -6 | -8 | -10 | 4 | 2 | 0 |

■ All states of form $(7, \cdot)$ and $(\cdot, 7)$ eliminated.
■ Then, 3 strictly dominates 5 .

## "Exceeding Barbara's Exp": States-First Proc Rd 3

| You/Barbara | $(1,1)$ | $(1,3)$ | $(3,1)$ | $(3,3)$ |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 2 | 2 |
| 3 | -4 | -6 | 2 | 0 |

■ All states of form $(5, \cdot)$ and $(\cdot, 5)$ eliminated.

- No more choices strictly dominated.
$\Rightarrow$ Switch to elimination of choices and expectations.
- 1 weakly dominates 3.
- Hence, 3 is optimal iff $e_{i}(3,1)=1$ and 1 is optimal for any expectation.


## "Exceeding Barb's Exp": States-First Proc Rd 4 ff

■ Given 3-fold reduced decision problem, belief in Barbara's rationality requires that $e_{1}(3 \mid 3)=1$.
■ Hence, surviving states at rd 4 in $\operatorname{Conv}\{(1,1),(1,3),(3,3)\}$.


- Since state $(3,1)$ is eliminated, choice 3 is also eliminated. $\Rightarrow 1$ uniquely rational under CBR for both players.


## Interacting Belief Restrictions \& Strict Dominance

■ In "Black and White Dinner with a Twist" and other examples, standard iterated strict dominance is insufficient for CBR.

■ This is due to interacting belief restrictions.
■ E.g., in "Dinner w twist" your choosing black requires sufficiently high expectation of $\left(w_{2}, w_{1}\right)$.

■ But any such expectation for you goes beyond Barbara's maximum belief in $w_{1}$ while rationally choosing $w_{2}$.

■ Hence, belief in Barbara's rationality eliminates these expectations and your choice black.

## Interacting Belief Restrictions \& Strict Dominance

- Interacting belief restrictions are the reason why iterated strict dominance does not work in psychological games.

■ Conversely, special psychological games may exclude such interactions, allowing us to use strict dominance.

■ In psychological games as studied here, this will be true for player $i$ if:

- $i$ cares only about $j$ 's behavior and $j$ only cares about $i$ 's first-order beliefs.
- $i$ cares only about $j$ 's first-order beliefs.

■ In particular, iterated strict dominance works for both players if one player only cares about behavior and the other only cares about first-order beliefs.

## Example: "Barbara's Birthday"

■ You choose to buy a necklace, ring, or bracelet as a gift for Barbara.
■ You personally prefer necklace over ring over bracelet. In addition, you seek to surprise Barbara with your gift. Meanwhile, Barbara seeks to guess which gift you bought her.

| You | $(\cdot, n)$ | $(\cdot, r)$ | $(\cdot, b)$ |  | Barbara | $(n, \cdot)$ | $(r, \cdot)$ | $(b, \cdot)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| necklace | 0 | 3 | 3 |  | necklace | 1 | 0 | 0 |
| ring | 2 | 0 | 2 |  | ring | 0 | 1 | 0 |
| bracelet | 1 | 1 | 0 |  | bracelet | 0 | 0 | 1 |

- Your behavior matters for Barbara but not vice versa. Similarly, you care what Barbara expect you to do but not vice versa.
- Hence, no belief restrictions for you and Barbara interact in this game.
$\Rightarrow$ Iterated strict dominance finds choices consistent with CBR.


## "Barbara's Birthday": Rationality

| You | $(\cdot, n)$ | $(\cdot, r)$ | $(\cdot, b)$ |  | Barbara | $(n, \cdot)$ | $(r, \cdot)$ | $(b, \cdot)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| necklace | 0 | 3 | 3 |  | necklace | 1 | 0 | 0 |
| ring | 2 | 0 | 2 |  | ring | 0 | 1 | 0 |
| bracelet | 1 | 1 | 0 |  | bracelet | 0 | 0 | 1 |

■ bracelet strictly dominated for you by (e.g.) $0.4 \cdot$ necklace $+0.6 \cdot$ ring.
■ No choice dominated for Barbara.

## "Barbara's Birthday": Belief in Rationality

| You | $(\cdot, n)$ | $(\cdot, r)$ | $(\cdot, b)$ |  | Barbara | $(n, \cdot)$ | $(r, \cdot)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| necklace | 0 | 3 | 3 |  | necklace | 1 | 0 |
| ring | 2 | 0 | 2 |  | ring | 0 | 1 |
|  |  |  |  |  | bracelet | 0 | 0 |

■ Under belief in rationality, Barbara discards all states of form $(b, \cdot)$.
■ Then, bracelet strictly dominated by (e.g.) $0.5 \cdot$ necklace $+0.5 \cdot$ ring .
■ No choice or state eliminated for you.
Caution: $(\cdot, b)$ eliminated for you at up to 2-fold belief in rationality!

## "Barbara's Bday": Common Belief in Rationality

| You | $(\cdot, n)$ | $(\cdot, r)$ |  | Barbara | $(n, \cdot)$ | $(r, \cdot)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| necklace | 0 | 3 |  | necklace | 1 | 0 |
| ring | 2 | 0 |  | ring | 0 | 1 |

■ Under up to 2-fold belief in rationality, you discard $(\cdot, b)$ as well as $(b, n)$ and ( $b, r$ ).
■ Finally, under up to 3-fold belief in rationality, Barbara discards $(n, b)$ and $(r, b)$.

■ No further choices are eliminated, so the procedure stops.

- Reduced decision problems:

| You | $(n, n)$ | $(n, r)$ | $(r, n)$ | $(r, r)$ |  | Barbara | $(n, n)$ | $(n, r)$ | $(r, n)$ | $(r, r)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| necklace | 0 | 3 | 0 | 3 |  | necklace | 1 | 1 | 0 | 0 |
| ring | 2 | 0 | 2 | 0 |  | ring | 0 | 0 | 1 | 1 |

## "Barbara's Birthday": Beliefs Diagram

■ To support your choices, only need partial beliefs diagram, omitting beliefs about Barbara's behavior:


■ Now complete diagram to also support Barbara's choices:


