

# IDENTIFYING BELIEF-DEPENDENT PREFERENCES

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## MOTIVATION

Individuals **avoid** and **distort** information:

- investors overreact to good news (Daniel & Hirshleifer, 2015);
- donors are uninformed about their impact (Niehaus, 2014);
- medical patients avoid testing (Golman et al., 2017).

A possible rationalisation is that individuals care about beliefs *per se*:

- no separation between beliefs and preferences.
- belief revision depends on preferences;
- hard to identify beliefs, preferences and updating rule.

## THIS PAPER

This paper:

1. Dynamic model of belief-dependent preferences (BDP);
2. Axiomatic characterisation of such a model;
3. Derivation of individuals' belief updating rule.

Main contribution:

- testable predictions to reject the theory;
- joint identification of beliefs, preferences and updating rule.

## MODEL IN A NUTSHELL

Key features:

- the individual cares about beliefs per se;
- she **distorts beliefs** away from Bayesian updating to increase her welfare;
- she is then **tempted** to act according to her distorted beliefs;
- ex ante, she **anticipates** such belief and choice distortion. (Cobb-Clark et al., 2022)

**Main result:** axiomatic characterisation of BDP preferences and updating rules.

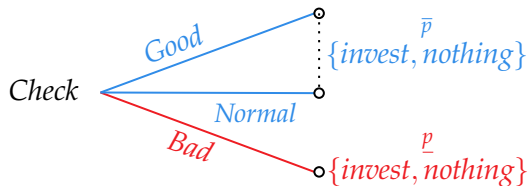
## OUTLINE

1. Illustration of the model through an example
2. Comparison with the literature
3. Full Model
4. Main axioms and result

## ILLUSTRATIVE EXAMPLE

An investor chooses whether to check her portfolio or not.

If she does, she observes prices and can invest or do nothing.

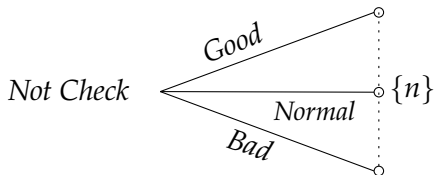
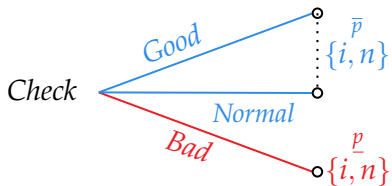


Investing is optimal only in the *Good* state.

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If she does, she observes prices and can invest or do nothing.



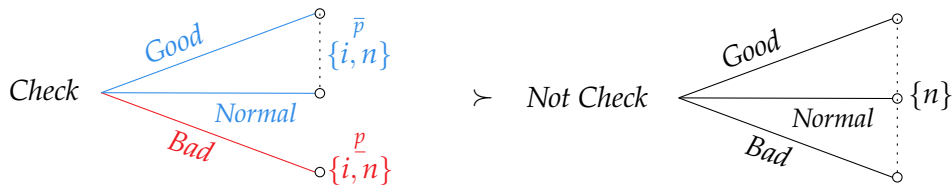
Prices both constitute a **signal** and induce a **menu** of feasible outcomes.

## ILLUSTRATIVE EXAMPLE

She likes believing the state is good:

- under  $\bar{p}$ : overweights the positive signal and invests;
- under  $\underline{p}$ : suffers from the bad news.

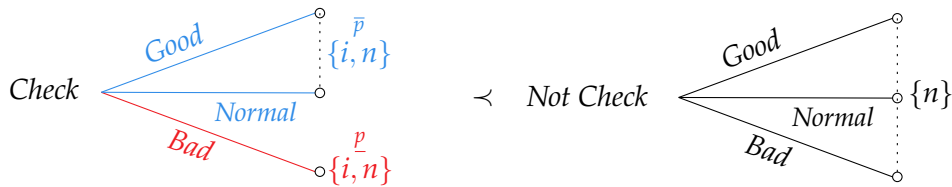
**Trade-off:** receiving pleasant information but acting under a distorted belief.





## ILLUSTRATIVE EXAMPLE

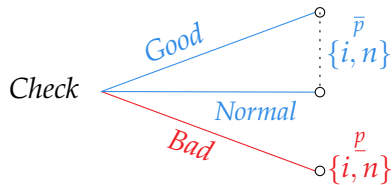
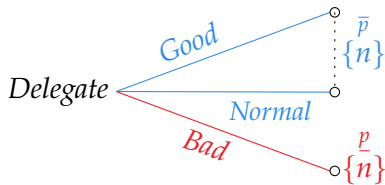
She might also prefer not to check because she expects the bad signal.



Both excessive trading and the ostrich effect constitute empirical puzzles in finance (Daniel & Hirshleifer, 2015; Golman et al., 2017).

## ILLUSTRATIVE EXAMPLE

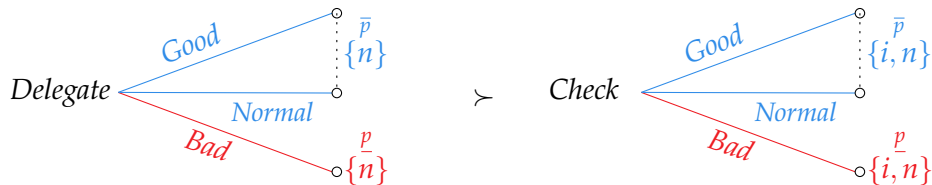
**Solution:** commit not to invest, e.g. by delegating to a financial advisor or algorithm.



**Trade-off:** receiving pleasant information but acting under a distorted belief.

## ILLUSTRATIVE EXAMPLE

**Solution:** commit not to invest, e.g. by delegating to a financial advisor or algorithm.



**Trade-off:** receiving pleasant information but acting under a distorted belief.

Commitment might be welfare enhancing under belief-dependent preferences.

## LITERATURE

- *Decision Theory*. Liang (2017), Dillenberger & Raymond (2020) Rommeswinkel et al. (2023).

Contribution: **Belief revision rule, identification.**

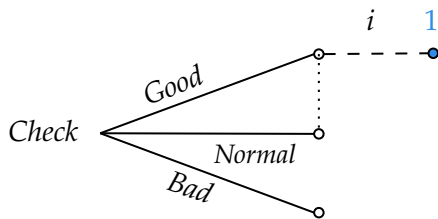
- *Menu Choice*. Gul & Pesendorfer (2001), Ozdenoren (2002), Epstein (2006), Epstein & Kopylov (2007).

Contribution: **Novel primitive object of choice.**

- *Belief-Dependent Preferences*. Brunnermeier & Parker (2005), Eliaz & Spiegel (2006), Bénabou & Tirole (2016), Golman et al. (2017), Battigalli & Dufwenberg (2022).

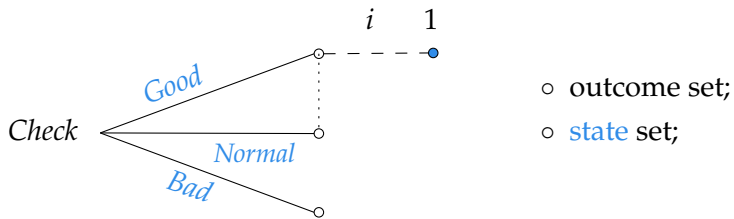
Contribution: **Generality, derivation of belief revision rule, identification.**

## MODEL: ACTS

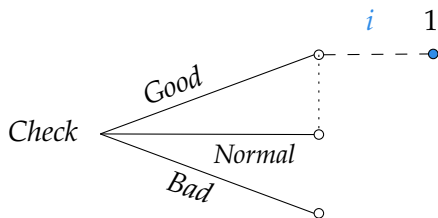
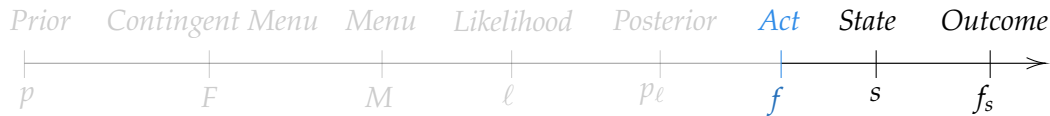


- outcome set (net financial return);

## MODEL: ACTS

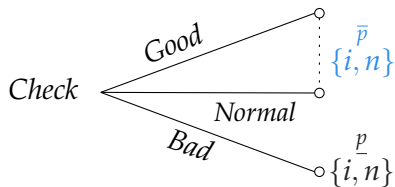


# MODEL: ACTS



- outcome set;
- state set;
- **acts**  $f : \text{States} \rightarrow \text{Outcomes}$ ;

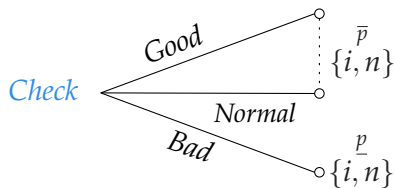
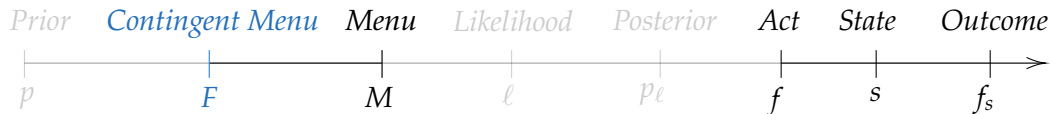
## MODEL: MENUS AND CONTINGENT MENUS



- outcome set;
- state set;
- acts  $f : \text{States} \rightarrow \text{Outcomes}$ ;
- a set of acts is a **menu**  $M$ ;

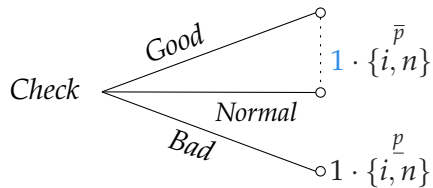


## MODEL: MENUS AND CONTINGENT MENUS



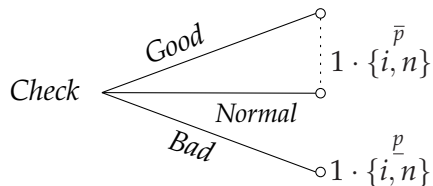
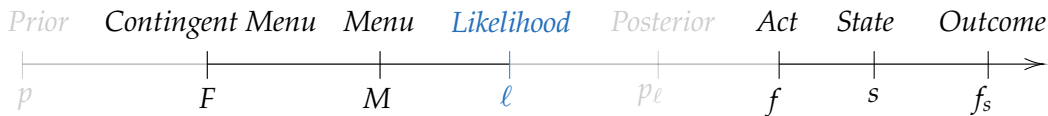
- outcome set;
- state set;
- acts  $f : \text{States} \rightarrow \text{Outcomes}$ ;
- a set of acts is a menu  $M$ ;
- a *contingent menu* is  $F : \text{States} \rightarrow \text{Menus}$ .

## MODEL: INFORMATION



- a contingent menu is  $F : States \rightarrow Menus$ ;
- probability  $M$  realises in state  $s$  is  $F_s(M)$ ;

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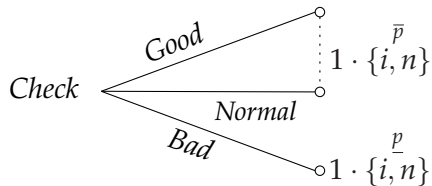
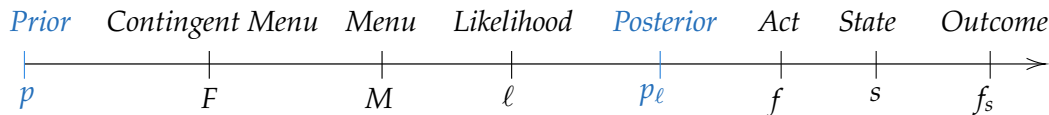


- a contingent menu is  $F : States \rightarrow Menus$ ;
- probability  $M$  realises in state  $s$  is  $F_s (M)$ ;

The normalised likelihood of state *Good* after realisation of menu  $\{\bar{p}, i, n\}$  is

$$\ell (Good) = \frac{1}{1 + 1} = \frac{1}{2}.$$

## MODEL: INFORMATION

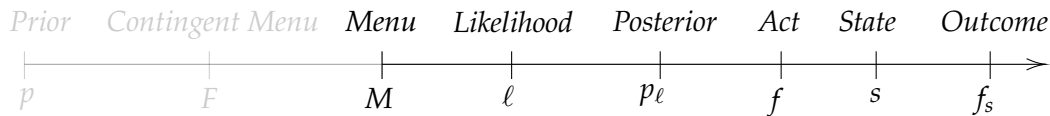


- a contingent menu is  $F : States \rightarrow Menus$ ;
- probability  $M$  realises in state  $s$  is  $F_s(M)$ ;
- prior  $p$  and likelihood  $\ell$  induce posterior  $p_\ell$ .

The likelihood of state  $s$  after realisation of menu  $M$  from the contingent menu  $F$  is

$$\ell_{M,F}(s) = \frac{F_s(M)}{\sum_{s' \in S} F_{s'}(M)}.$$

## UTILITY OVER ACTS



Expected utility of act  $f$  at likelihood  $\ell$

$$\sum_s p_\ell(s) u(f_s; \ell).$$

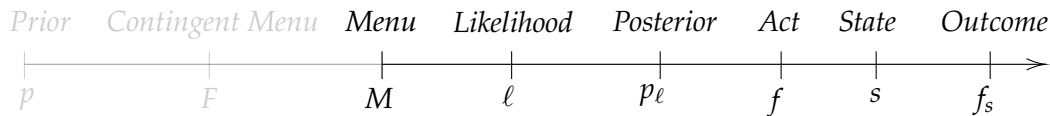
Individual distorts the likelihood to  $\ell^*$

$$\sum_s p_{\ell^*}(s) u(f_s; \ell^*).$$

The main theorem identifies conditions under which the individual solves

$$\max_{f \in M} \left\{ \underbrace{\sum_s p_\ell(s) u(f_s; \ell)}_{EU} + \alpha_\ell \underbrace{\sum_s p_{\ell^*}(s) u(f_s; \ell^*)}_{\text{distorted EU}} \right\}.$$

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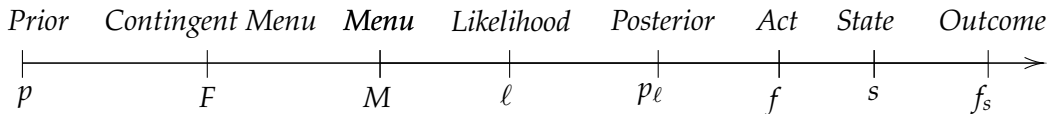
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## UTILITY OVER CONTINGENT MENUS



The individual anticipates her choices and cost of temptation

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) + \alpha_\ell \sum_s p_{\ell^*}(s) u(\textcolor{blue}{f}_s; \ell^*) \right\} \\ - \max_{f' \in M} \alpha_\ell \sum_s p_{\ell^*}(s) u(\textcolor{red}{f}'_s; \ell^*) .$$

The positive number  $\alpha_\ell$  captures the *strength of motivated reasoning*.

## UTILITY OVER CONTINGENT MENUS

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) + \alpha_\ell \sum_s p_{\ell^*}(s) u(f_s; \ell^*) \right\} \\ - \max_{f' \in M} \alpha_\ell \sum_s p_{\ell^*}(s) u(f'_s; \ell^*) .$$

Expected utility of contingent menu  $F$  is

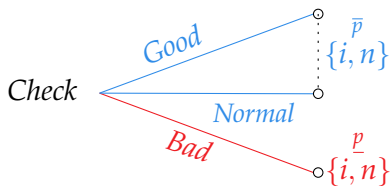
$$\mathcal{U}(F) = \sum_M \sum_s p(s) F_s(M) \mathcal{U}(M; \ell_{M,F}) .$$

Choices over **contingent menus** are sufficient for identification of  $u, p, \ell^*, \alpha_\ell$ .



## DISTORTED LIKELIHOOD

Each likelihood  $\ell$  is consistent with one even  $S_\ell$ .

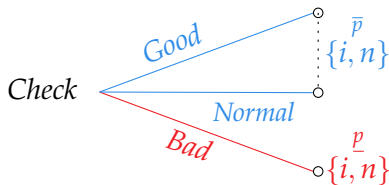


The distorted likelihood  $\ell_S^*$  at event  $S$  is the best one according to  $u$ :

$$\ell_S^* \in \arg \max_{\ell \in \Delta(S)} u(x; \ell) \quad \dots \quad \text{not well defined!}$$

## DISTORTED LIKELIHOOD

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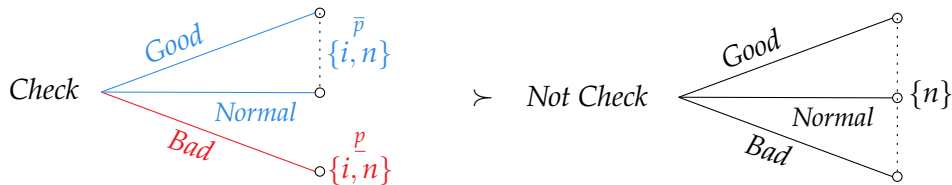
The distorted likelihood  $\ell_S^*$  at event  $S$  is the best one *under the best outcome*:

$$\ell_S^* \in \arg \max_{\ell \in \Delta(S)} \max_x u(x; \ell).$$

**Asymmetric updating:** preferred likelihoods are not distorted.

From choice?

## BACK TO THE EXAMPLE



Preferences over financial gains and beliefs are:

$$u(x; \ell) = v(x) + p_{\ell}(\text{Good}).$$

The investor expects to distort  $\ell$  so that  $p_{\ell^*}(\text{Good}) = 1$ .

Optimistic beliefs lead her to invest more than what prescribed by Bayes rule.

## BDP IMPLY NON-BAYESIAN UPDATING

Say the true likelihood  $\ell$  coincides with the distorted  $\ell^*$ :

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) + \alpha_\ell \sum_s p_\ell(s) u(f_s; \ell) \right\} \\ - \max_{f' \in M} \alpha_\ell \sum_s p_\ell(s) u(f'_s; \ell) .$$

The second and third terms cancel out, only EU under Bayesian updating remains.

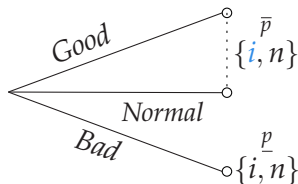
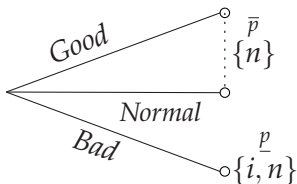
If  $u$  does not depend on  $\ell$ , preferences over likelihoods are flat.

A novelty of the model is that BDP **imply** non-Bayesian updating.

## AXIOM: IDENTICAL INFERENCE INDEPENDENCE

### AXIOM

*(Informal) The individual only satisfies independence for mixtures of contingent menus inducing the same inference for each of their menu realisations.* Full



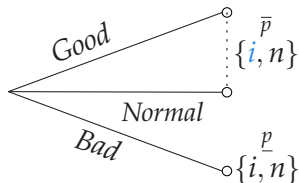
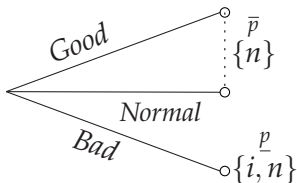
Relaxing independence leads to dynamic inconsistency.

## MAIN AXIOM: STRATEGIC RATIONALITY FOR BEST LIKELIHOOD

### AXIOM

*(Informal) There is no temptation when, all else equal, the available menu comprises the best choices based on both the Bayesian update and the favourite posterior.*

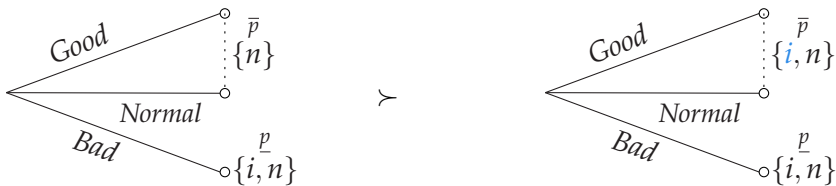
Full



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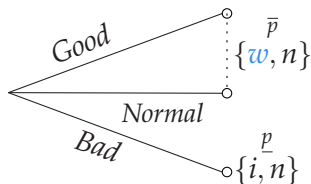
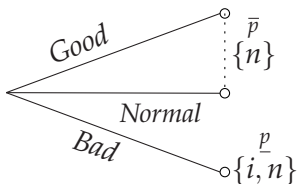
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*(Informal) There is no temptation when, all else equal, the available menu comprises the best choices based on both the Bayesian update and the favourite posterior.*

Full



Under no BDP, all posteriors are "favourite" and the axiom implies no temptation.

No temptation implies the model reduces to Expected utility and Bayesian updating.

## MAIN RESULT

### Theorem

*Preferences over contingent menus are represented by Equations (1) and (2) if and only if they satisfy **Strategic Rationality for Best Likelihood** and other "standard" axioms.*

$$\mathcal{U}(F) = \sum_M \sum_s p(s) F_s(M) \mathcal{U}(M; \ell_{M,F}). \quad (1)$$

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) + \alpha_\ell \sum_s p_{\ell_{S_\ell}^*}(s) u(f_s; \ell_{S_\ell}^*) \right\} \\ - \max_{f' \in M} \alpha_\ell \sum_s p_{\ell_{S_\ell}^*}(s) u(f'_s; \ell_{S_\ell}^*). \quad (2)$$

Prior belief  $p$ , utilities  $u$ , distorted likelihoods  $\ell^*$  and weights  $\alpha$  are unique. Axioms?

## WHY THIS MODEL

1. Generality: how do individuals choose between information sources?
2. Refutability: predictions of previous theories overlap, also with non BDP.
3. Identification: how to intervene if preferences and beliefs are confused?
4. Dual-self: which self matters for welfare analysis?

## CONCLUSION

Theory of BDP and belief updating tested via choices of contingent menus:

- dynamically consistent individual anticipates she distorts beliefs;
- asymmetric updating and no distortion of zero probability events;
- identification of BDP, non-Bayesian updating and strength of motivated reasoning.

Other applications in the paper:

- donors avoid and distort information about their impact;
- politicians send poor information to induce polarisation.

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## COST OF SELF-CONTROL

Identification of  $\alpha_\ell$  allows elaborating on its behavioural meaning

$$\alpha_\ell = \frac{\mathcal{U}(\{f, x\}, \ell) - \mathcal{U}(\{f, x'\}, \ell)}{u(x, \ell) - u(x', \ell)}.$$

It is the marginal cost of self-control at likelihood  $\ell$ .

[Back](#)

## ALTERNATIVE REPRESENTATION WITH COST

The representation can be written as either

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) + \alpha_\ell \sum_s p_{\ell_{S_\ell}^*}(s) u(f_s; \ell_{S_\ell}^*) \right\} \\ - \max_{f' \in M} \alpha_\ell \sum_s p_{\ell_{S_\ell}^*}(s) u(f'_s; \ell_{S_\ell}^*).$$

or

$$\mathcal{U}(M; \ell) = \max_{f \in M} \left\{ \sum_s p_\ell(s) u(f_s; \ell) - \alpha_\ell c(f, u, S_\ell) \right\}.$$

## AXIOMS: BASICS

### AXIOM

*(Order)*. Preferences over contingent menus are a continuous weak order. [Full](#)

### AXIOM

*(Nondegeneracy)*. There exist at least one outcome better than another. [Full](#)

### AXIOM

*(State Independence)*. Preferences over outcomes do not depend on the state.

### AXIOM

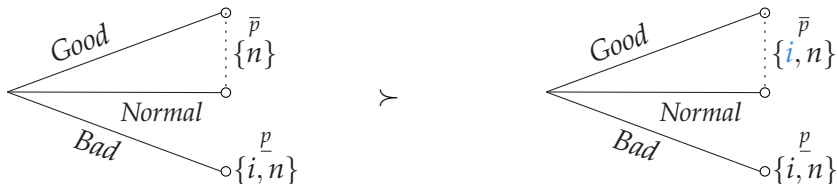
*(Full support)*. The individual assigns ex-ante positive probability to all states.



## AXIOMS: SET-BETWEENNESS

### AXIOM

*The individual is weakly worse if a menu is enhanced with ex-ante dominated options, because these induce temptation.*



# AXIOMS: BASICS I

## AXIOM

*(Order). The ranking  $\succsim$  is complete and transitive.*

## AXIOM

*(Continuity). For all contingent menus  $F$  the sets*

$$\{F' \mid F' \succsim F\} \text{ and } \{F' \mid F' \precsim F\}$$

*are closed.*

## AXIOMS: BASICS II

Substitute from  $F$  any occurrence of  $M$  with  $M'$  to get  $F_{M \rightarrow M'}$ .

### AXIOM

*(Nondegeneracy)*. There exist outcomes  $y, y'$  such that  $y \succ y'$ .

### AXIOM

*(State Independence)*. For all contingent menus  $F$ , menus  $L, L', M$  and states  $s, s'$ ,

$$F \succsim F_{LsM \rightarrow L'sM} \Rightarrow F \succsim F_{Ls'M \rightarrow L's'M}.$$

### AXIOM

*(Full Support)*. For each state  $s$ , there exist contingent menus  $F$  and  $F'$  such that for all menus  $M$  it holds that  $F_{s'}(M) = F'_{s'}(M)$  for every  $s' \neq s$  and  $F \approx F'$ .

## AXIOMS: IDENTICAL INFERENCE INDEPENDENCE

The support of  $F$  is

$$\mathcal{M}_F := \{M \in \mathcal{M} \mid F_s(M) > 0 \text{ for some } s \in S\}.$$

### Definition

**(Identical Inference (II))** Two contingent menus  $F$  and  $F'$  satisfy **identical inference** if, for each menu  $M \in \mathcal{M}_F \cap \mathcal{M}_{F'}$  their likelihood is the same  $\ell_{M,F} = \ell_{M,F'}$ .

### AXIOM

**(II Independence).** For all  $0 < \lambda \leq 1$  and contingent menus  $F, F', F''$  such that  $F$  and  $F''$  satisfy II and  $F'$  and  $F''$  satisfy II,  $F \succsim F'$  if and only if  $\lambda F + (1 - \lambda) F'' \succsim \lambda F' + (1 - \lambda) F''$ .

## AXIOMS: SET-BETWEENNESS

Substitute from  $F$  any occurrence of  $M$  with  $M'$  to get  $F_{M \rightarrow M'}$ .

### AXIOM

*(Set-Betweenness). For all contingent menus  $F$  and menus  $M, M'$ ,*

$$F \succsim F_{M \rightarrow M'} \Rightarrow F \succsim F_{M \rightarrow M \cup M'} \succsim F_{M \rightarrow M'}.$$

## AXIOMS: STRATEGIC RATIONALITY FOR BEST LIKELIHOOD

Substitute from  $F$  any occurrence of  $M$  with  $M'$  to get  $F_{M \rightarrow M'}$ .

For each menu  $M$  and likelihood  $\ell$  define the set

$$\mathcal{F}_{M,\ell} := \{f \in M \mid F \succsim F_{\{f\} \rightarrow \{f'\}} \text{ for all } f' \in M \text{ and some } F \text{ such that } \ell_{\{f\},F} = \ell\}.$$

### AXIOM

*(Strategic Rationality for Best Likelihood (SRBL)). For each:*

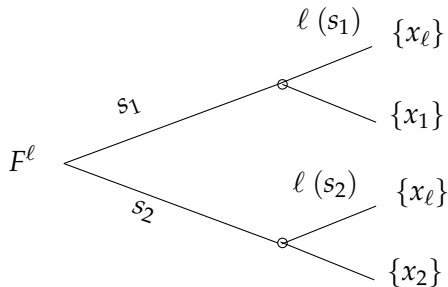
- couple of menus  $M, M'$ ;*
- contingent menu  $F$  such that  $\ell_{M,F} = \ell$ ;*

*if  $\mathcal{F}_{M \cup M',\ell} \cap \mathcal{F}_{M \cup M',\ell_{S_\ell}^*} \neq \emptyset$  for at least one  $\ell_{S_\ell}^*$ , then*

$$F \succsim F_{M \rightarrow M'} \Rightarrow F \sim F_{M \rightarrow M \cup M'}.$$

## DISTORTED LIKELIHOODS FROM CHOICE

For each  $\ell$  define contingent menus  $F^\ell$ .



For each  $S$  define distorted likelihoods:

$$\ell_S^* \in \left\{ \ell \in \Delta(S) \mid F^\ell \succsim F^{\ell'} \text{ for all } \ell' \in \Delta(S) \right\}.$$