

# **BELIEF-DEPENDENT PREFERENCES AND UPDATING**

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## MOTIVATION

Individuals derive pleasure or pain from having specific beliefs.

Consequently, they **avoid** or **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).

Economists need models aligned with these phenomena for prediction and policy.

## BELIEF-DEPENDENT PREFERENCES

Proposal: Belief-dependent preferences (Bénabou & Tirole, 2016; Köszegi, 2010).

Features of existing theories:

- object of choice **unobservable**, such as beliefs, probability to forget;
- no **identification**, many pairs of beliefs and preferences are choice equivalent;
- BDP and non-Bayesian updating are **disjoint assumptions**.

**This paper:**

- propose novel **observable** choice data allowing identification (if and only if);
- BDP **imply** a specific form of non-Bayesian updating.

## THIS PAPER

Preferences depend on the individual's **posterior beliefs**.

The individual **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.

## ILLUSTRATIVE EXAMPLE

An investor decides whether to check the balance in her portfolio.

If she does, she observes price  $p$  and can invest ( $i_p$ ) or withdraw ( $w_p$ ).

State	Check
	Menus
Good Normal	$invest_p, withdraw_p$
Bad	$invest_q, withdraw_q$

Upon observing price  $p$ , she infers the state of the market is not bad.

When she sees price  $q$ , she knows the state of the market is bad.

## ILLUSTRATIVE EXAMPLE

Before checking, she anticipates to overweight evidence and invest too much. However, she might want to check anyway to obtain pleasant information.

Check			Not Check	
State	Menus		State	Menus
Good	$i_p, w_p$	$\succ$	Good	$nothing (\emptyset)$
Normal			Normal	
Bad	$i_q, w_q$		Bad	

Table: Excessive investment.

**Trade-off:** not receiving information vs acting under a distorted belief.

## ILLUSTRATIVE EXAMPLE

She might also prefer not to check because she expects unpleasant information.

Check			Not Check	
State	Menus		State	Menus
Good	$i_p, w_p$	$\succ$	Good	$\emptyset$
Normal			Normal	
Bad	$i_q, w_q$		Bad	

**Table:** Information avoidance under negative prior beliefs, "ostrich effect".

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

## ILLUSTRATIVE EXAMPLE

**Solution:** delegate to a financial advisor, allowing her to commit not to invest.

Delegate	
State	Menus
Good	$w_p$
Normal	
Bad	$w_q$

Check	
State	Menus
Good	$i_p, w_p$
Normal	
Bad	$i_q, w_q$

Not Check	
State	Menus
Good	$\emptyset$
Normal	
Bad	



## ILLUSTRATIVE EXAMPLE

Commitment allows her to obtain information without being tempted to overinvest.

Delegate			Check			Not Check	
State	Menus		State	Menus		State	Menus
Good	$w_p$	$\succ$	Good	$i_p, w_p$	$\succ$	Good	$\emptyset$
Normal			Normal			Normal	
Bad	$w_q$		Bad	$i_q, w_q$		Bad	

**Table:** Commitment under positive prior belief to avoid excessive investment.

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.**

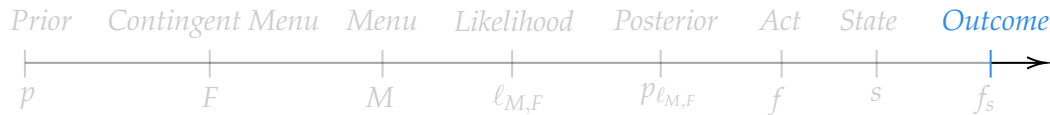
- *Menu Choice*. Gul & Pesendorfer (2001), Ozdenoren (2002), Epstein (2006), Epstein & Kopylov (2007).

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

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

Contribution: **Identification, interaction of tastes and belief revision.**

## MODEL: ACTS



State	Menus
Good Normal	$i_p, w_p$
Bad	$i_q, w_q$

- **outcome** set (net financial return);

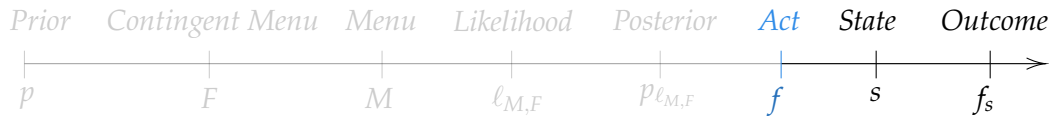
## MODEL: ACTS



State	Menu
Good Normal	$i_p, w_p$
Bad	$i_q, w_q$

- outcome set;
- **state** set;

## MODEL: ACTS



State	Menu
Good	$i_p, w_p$
Normal	
Bad	$i_q, w_q$

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

## MODEL: MENUS AND CONTINGENT MENUS



State	Menu
Good Normal	$i_p, w_p$
Bad	$i_q, w_q$

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

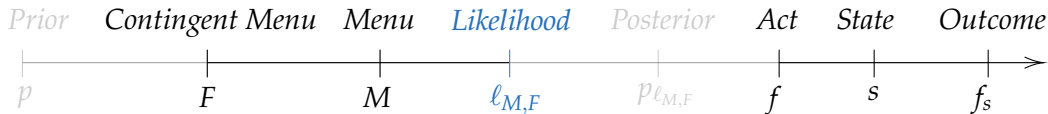
## MODEL: MENUS AND CONTINGENT MENUS



State	Menu
Good Normal	$i_p, w_p$
Bad	$i_q, w_q$

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

## INFORMATION



State	Menu
Good	$1 \cdot \{i_p, w_p\}$
Normal	
Bad	$1 \cdot \{i_q, w_q\}$

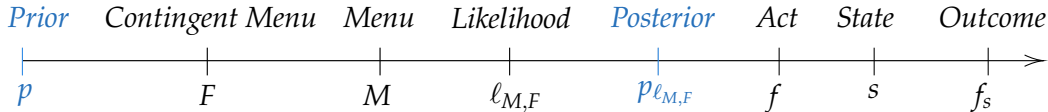
- a contingent menu is  $F : \text{States} \rightarrow \text{Menus}$ ;
- probability menu  $M$  realises in state  $s$  is  $F_s(M)$ ;

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

$$\ell_{M,F}(\text{Good}) = \frac{1}{1+1} = \frac{1}{2}.$$



## INFORMATION



State	Menu
Good	$1 \cdot \{i_p, w_p\}$
Normal	
Bad	$1 \cdot \{i_q, w_q\}$

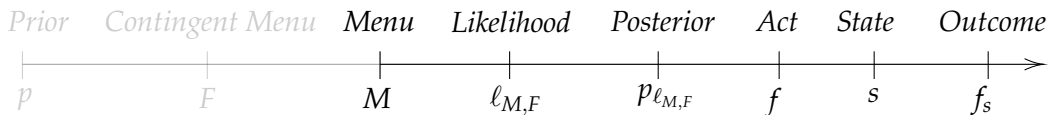
- a contingent menu is  $F : \text{States} \rightarrow \text{Menus}$ ;
- probability menu  $M$  realises in state  $s$  is  $F_s(M)$ ;
- prior  $p$  and likelihood  $\ell_{M,F}$  induce posterior  $p_{\ell_{M,F}}$ .

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

$$\ell_{M,F}(\text{Good}) = \frac{1}{1+1} = \frac{1}{2}$$

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

## UTILITY OVER ACTS



Expected utility of act  $f$  at likelihood  $\ell_{M,F}$

$$\sum_s p_{\ell_{M,F}}(s) u(f_s; \ell_{M,F}) .$$

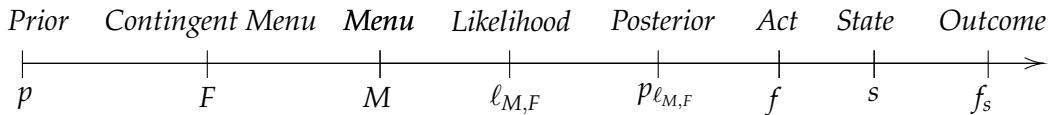
Under distorted likelihood  $\ell_{M,F}^*$

$$\sum_s p_{\ell_{M,F}^*}(s) u(f_s; \ell_{M,F}^*) .$$

The main theorem identifies conditions under which the individual solves

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

## UTILITY OVER CONTINGENT MENUS



The individual anticipates her choices and cost of temptation

$$\mathcal{U}(M; \ell_{M,F}) = \max_{f \in M} \left\{ \sum_s p_{\ell_{M,F}}(s) u(f_s; \ell_{M,F}) + \alpha_{\ell_{M,F}} \sum_s p_{\ell_{M,F}^*}^*(s) u(f_s; \ell_{M,F}^*) \right\} \\ - \max_{f' \in M} \alpha_{\ell_{M,F}} \sum_s p_{\ell_{M,F}^*}^*(s) u(f'_s; \ell_{M,F}^*) . \quad \text{Alpha?} \quad \text{Cost?}$$

Expected utility of contingent menu  $F$  is

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

## UTILITY OVER CONTINGENT MENUS

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

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.

## UTILITY OVER CONTINGENT MENUS

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.

BDP **imply** non-Bayesian updating.

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

## DISTORTED LIKELIHOOD

The distorted likelihood  $\ell_{S'}^*$  at event  $S'$  is the best one when any outcome is available:

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

If a state has probability 0, its likelihood cannot be distorted.

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

## 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

Delegate	
State	Menu
Good	$w_p$
Normal	
Bad	$w_q$

State	Menu
Good	$i_p, w_p$
Normal	
Bad	$w_q$

# MAIN AXIOM: STRATEGIC RATIONALITY FOR BEST LIKELIHOOD

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Delegate				
State	Menu		State	Menu
Good			Good	
Normal	$w_p$	$\succ$	Normal	$i_p, w_p$
Bad	$w_q$		Bad	$w_q$



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Delegate	
State	Menu
Good	$w_p$
Normal	
Bad	$w_q$

State	Menu
Good	$\emptyset$
Normal	
Bad	$w_q$

## MAIN AXIOM: STRATEGIC RATIONALITY FOR BEST LIKELIHOOD

### AXIOM

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Full

Delegate					
State	Menu			State	Menu
Good				Good	
Normal	$w_p$			Normal	$\emptyset$
Bad	$w_q$	$\sim$		Bad	$w_q$

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.*

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

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

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

## BACK TO THE EXAMPLE

Delegate			Check			Not Check	
State	Menus		State	Menus		State	Menus
Good	$w_p$	$\succ$	Good	$i_p, w_p$	$\succ$	Good	$\emptyset$
Normal			Normal			Normal	
Bad	$w_q$		Bad	$i_q, w_q$		Bad	

**Table:** Commitment under positive prior belief to avoid excessive investment.

$$\begin{aligned}
 \mathcal{U}(M; \ell_{M,F}) = & \max_{f \in M} \left\{ \sum_s p_{\ell_{M,F}}(s) u(f_s; \ell_{M,F}) + \alpha_{\ell_{M,F}} \sum_s p_{\ell_{M,F}^*}(s) u(f_s; \ell_{M,F}^*) \right\} \\
 & - \max_{f' \in M} \alpha_{\ell_{M,F}} \sum_s p_{\ell_{M,F}^*}(s) u(f'_s; \ell_{M,F}^*)
 \end{aligned}$$

## WHY THIS MODEL: OBSERVABILITY AND IDENTIFICATION

The primitive objects of choice, contingent menus, are observable, contrary to

- Choice of beliefs (Brunnermeier & Parker, 2005; Köszegi, 2010);
- Choice of probability to forget (Bénabou & Tirole, 2016).

Choices of information sources do not allow identification (Eliaz & Spiegel, 2006).

These papers only provide "if" results, hard to distinguish from other theories.

## WHY THIS MODEL: MULTIPLE SELVES AND UPDATING

Individual as the unit of choice:

- multiple selves render welfare analysis hard;
- under multiple selves, choices are dynamically inconsistent.

BDP and non-Bayesian updating are not disjoint, the first implies the second.

## 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

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

or

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

## 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: IDENTICAL INFERENCE INDEPENDENCE

### AXIOM

*The individual is only indifferent between mixtures of contingent menus inducing the same inference.*

Delegate	
State	Menu
Good	$i_p, n$
Normal	
Bad	$n$

State	Menu
Good	$n, w$
Normal	
Bad	$n$

## AXIOMS: SET-BETWEENNESS

### AXIOM

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

Delegate					
State	Menu			State	Menu
Good	$n$			Good	$i_p, n$
Normal				Normal	
Bad	$n$			Bad	$n$

$\succsim$

# 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

### AXIOM

*(Nondegeneracy). There exist outcomes  $y, y'$  in  $X$  for which  $y \succ y'$ .*

### 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

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

### AXIOM

*(Strategic Rationality for Best Likelihood). For all contingent menus  $F$ , menus  $M, M'$ , events  $S'$  and likelihoods  $\ell_{S'}$ , if  $\ell_{M, F} = \ell_{S'}$ ,  $(M \cup M')_{\ell_{S'}} \cap (M \cup M')_{\ell_{S'}^*} \neq \emptyset$  for some  $\ell_{S'}^*$ , then*

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