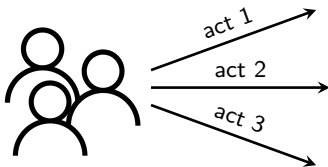


# Belief-Averaging and Relative Utilitarianism: Savage Meets Arrow

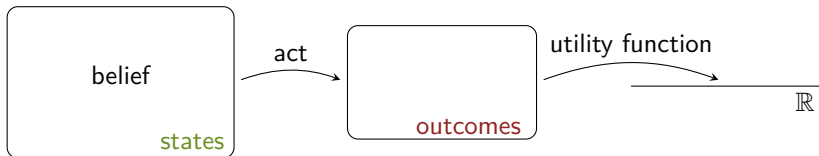
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# How to make collective decisions under uncertainty?



agents' preferences over acts  $\longrightarrow$  collective preferences over acts

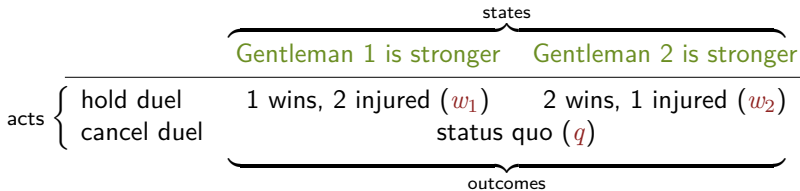
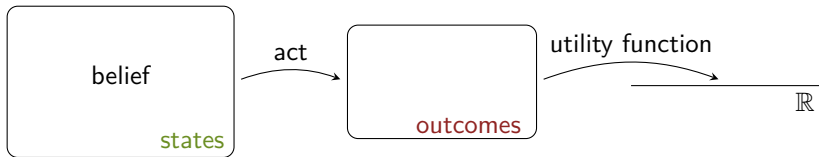
**Primitives:** states, outcomes, agents



**SEU preference:** ranking of acts by expected utility for some belief and utility function

**Preference profile:** tuple of SEU preferences for subset of agents

**Aggregation function:** function from profiles to SEU preferences



	belief		utility function		
	1 stronger	2 stronger	$w_1$	$w_2$	$q$
Gentleman 1	90%	10%	1	-3	0
Gentleman 2	10%	90%	-4	1	0

Belief-averaging and relative utilitarianism (*BARU*): average beliefs and sum up normalized utility functions

**Theorem.** *BARU* is the only anonymous aggregation function satisfying **restricted monotonicity** and **independence of redundant acts**

		states		
		Gentleman 1 is stronger	Gentleman 2 is stronger	
acts	{	hold duel	1 wins, 2 injured ( $w_1$ )	2 wins, 1 injured ( $w_2$ )
	cancel duel	status quo ( $q$ )		
		outcomes		

	belief		utility function				
	1 stronger	2 stronger	$w_1$	$w_2$	$q$		
Gentleman 1	90%	10%	.25	1	−.75	−3	0
Gentleman 2	10%	90%	−.8	−4	.2	1	0
<i>BARU</i>	50%	50%	−.55		−.55		0

$$\mathbb{E}(\text{cancel duel}) = 0 > -0.55 = \mathbb{E}(\text{hold duel})$$

Risk

Uncertainty

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Single-profile

linear aggregation  
of utilities  
(Harsanyi, 1955)

linear aggregation of  
beliefs and utilities  
(Gilboa et al., 2004)

Multi-profile

relative utilitarianism  
(Dhillon and Mertens, 1999)

belief-averaging and  
relative utilitarianism

# The Model



$(\Omega, \mathcal{E})$  measurable space of **states** of the world

$(O, \mathcal{F})$  measurable space of **outcomes**

$\{f: \Omega \rightarrow O: f \text{ measurable}\}$  **acts**

$\mathcal{R}$  **SEU preference relations** over acts

- **belief**: non-atomic probability measure on  $(\Omega, \mathcal{E})$
- **utility function**: measurable and bounded function  $O \rightarrow \mathbb{R}$

$$f \succcurlyeq g \iff \int_{\Omega} (u \circ f) d\pi \geq \int_{\Omega} (u \circ g) d\pi$$

choose  $u$  with  $\inf_{o \in O} u(o) = 0$  and  $\sup_{o \in O} u(o) = 1$

**This talk:** all preference relations are SEU

**Preference profile:** tuple of SEU preferences  $P = (\succsim_i)_{i \in I} \in \mathcal{R}^I$   
for finite  $I \subset \mathbb{N}$

**Aggregation function:** mapping every preference profile to a  
collective preference relation

$$F: \bigcup_{I \subset \mathbb{N}} \mathcal{R}^I \rightarrow \mathcal{R}$$

**Notation:**  $\pi_{\succsim}$  and  $u_{\succsim}$  the belief and utility function representing  
 $\succsim$  ( $\pi_i$  and  $u_i$  instead of  $\pi_{\succsim_i}$  and  $u_{\succsim_i}$ )

## Belief-averaging and relative utilitarianism

$$\pi_{BARU(P)} = \frac{1}{|I|} \sum_{i \in I} \pi_i$$

average of beliefs

$$u_{BARU(P)} = \sum_{i \in I} u_i$$

sum of normalized  
utility functions

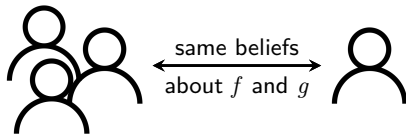
# Axioms on Aggregation Functions

## Restricted Monotonicity

For all  $P \in \mathcal{R}^I$ ,  $j \notin I$

$$f \sim_{F(P)} g$$

$$f \succ_j g$$



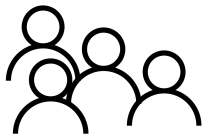
$$f_* \pi_{F(P)} = f_* \pi_j$$

$$g_* \pi_{F(P)} = g_* \pi_j$$

## Restricted Monotonicity

For all  $P \in \mathcal{R}^I$ ,  $j \notin I$

$$f \succ_{F(P_{+j})} g$$

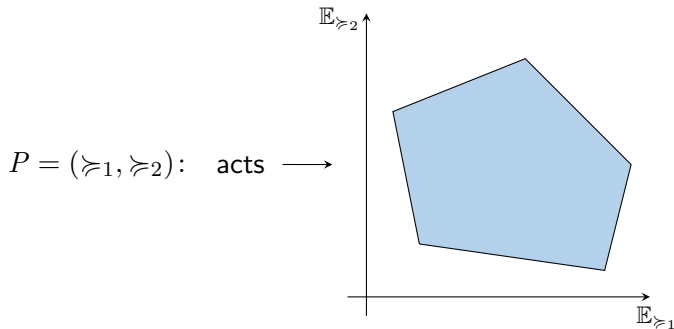


$$f_* \pi_{F(P)} = f_* \pi_j$$

$$g_* \pi_{F(P)} = g_* \pi_j$$

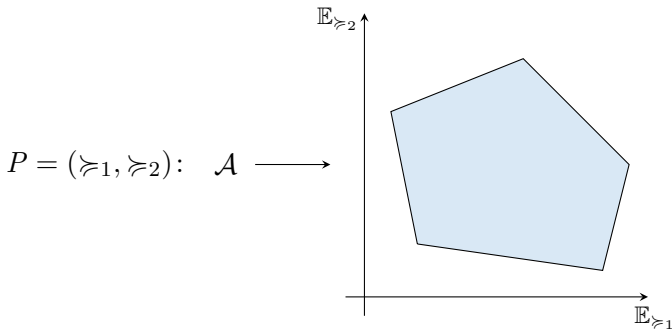
## Independence of redundant acts

A set of acts  $\mathcal{A}$  is **co-redundant** for a profile  $P$  if for every act, there is some act in  $\mathcal{A}$  so that every agent is indifferent between the two



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If

$\mathcal{A}$  is **co-redundant** for  $P$  and  $P'$  and

every agent has the **same preferences over  $\mathcal{A}$**  in  $P$  and  $P'$

then  $F(P)|_{\mathcal{A}} = F(P')|_{\mathcal{A}}$



## **Faithfulness**

The collective preferences for any single-agent profile are those of the only agent

## **No belief imposition**

No agent can dictate the collective belief

## **Continuity**

Small changes in the agents' preferences lead to small changes in the collective preferences

# Results

**Theorem.** Every aggregation function  $F$  satisfying the above axioms is **weighted belief-averaging** and **weighted utilitarian**. That is,  $\exists \mathbf{v}, \mathbf{w} \in \mathbb{R}_{++}^{\mathbb{N}}$

$$\pi_{F(P)} = \frac{1}{\sum_{i \in I} v_i} \sum_{i \in I} v_i \pi_i \quad u_{F(P)} = \sum_{i \in I} w_i u_i$$

**Corollary.** The only aggregation function satisfying the above axioms and **anonymity** is **belief-averaging** and **relative utilitarianism**.

restricted Pareto (Gilboa et al., 2004)

$$\pi_{F(P)} = \frac{1}{\sum_i v_i(P)} \sum_i v_i(P) \pi_i \quad u_{F(P)} = \sum_i w_i(P) u_i$$

restricted monotonicity

$$\sum_i v_i(\succsim_i) \pi_i \quad \sum_i w_i(\succsim_i) u_i$$

independence of redundant acts

$$\sum_i v_i \pi_i \quad \sum_i w_i u_i$$

Assume  $\pi_{F(P)} = \frac{1}{\sum_i v_i(P)} \sum_i v_i(P) \pi_i$  and  $u_{F(P)} = \sum_i w_i(P) u_i$

**Show:**  $w_i(P)$  is independent of  $P_{-i}$

**Idea:**

Use **restricted monotonicity** to show that  $\frac{w_i(P)}{w_j(P)}$  does not depend on  $\succ_k, k \neq i, j$

Consider  $P = (\succ_1, \succ_2)$  and  $P_{+3} = (\succ_1, \succ_2, \succ_3)$

$$\begin{aligned} u_{F(P_{+3})} &= \alpha u_{F(P)} + \beta u_3 = \alpha \left( \sum_{i=1}^2 w_i(P) u_i \right) + \beta u_3 \\ &= \sum_{i=1}^3 w_i(P_{+3}) u_i \end{aligned}$$

The relative weights of agents 1 & 2 are equal in  $P$  and  $P_{+3}$ :

$$w_1(P_{+3}) = \alpha w_1(P) \text{ and } w_2(P_{+3}) = \alpha w_2(P)$$

Can redefine  $w$  so that  $w_1(P) = w_1(P_{+3})$

Assume  $v_i$  is constant and  $w_i$  is independent of  $\pi_i$

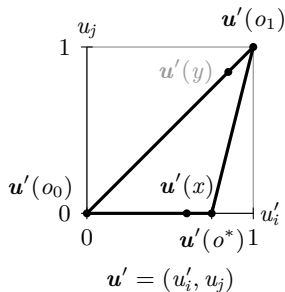
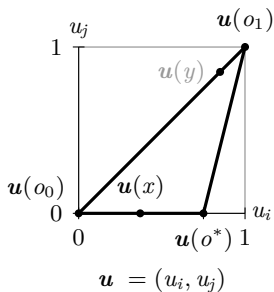
$\implies w_i: U \rightarrow \mathbb{R}_{++}$

**Show:**  $w_i(u_i)$  is constant

**Ideas:**

Use **IRA** to show that certain changes to  $u_i$  do not change  $w_i(u_i)$

Construct a path between any two utility functions along which  $w_i$  is constant



# Discussion

## Belief-averaging and relative utilitarianism

$$\pi_{F(P)} = \frac{1}{|I|} \sum_{i \in I} \pi_i \qquad u_{F(P)} = \sum_{i \in I} u_i$$

## Ex-ante relative utilitarianism (Sprumont, 2019)

$$f \succ_{F(P)} g \iff \sum_{i \in I} \mathbb{E}_{\pi_i}(f) \geq \sum_{i \in I} \mathbb{E}_{\pi_i}(g)$$

## Geometric aggregation of beliefs (Dietrich, 2019)

$$(\pi_{F(P)})(\omega) \sim \prod_{i \in I} (\pi_i(\omega))^{\frac{1}{|I|}}$$



The restricted monotonicity axiom requires **identification of beliefs**

Utilities are assumed to be **state independent**

Beliefs and utilities are **aggregated separately**

### **What's next?**

Weaker assumptions about preferences, incentives, dynamic updating of beliefs, . . .