

# The Synchronized Aggregation of Beliefs and Probabilities

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# Project Information

## Talk(s):

- Feldbacher-Escamilla, Christian J. (2017-09-24/2017-08-27). *Stability Preservation in Social Context*. Conference. Presentation (contributed). XXIV. Kongress der Deutschen Gesellschaft für Philosophie: Norm und Natur. HU Berlin: German Society for Philosophy (DGPhil).
- Feldbacher-Escamilla, Christian J. and Thorn, Paul D. (2016-07-04/2016-07-06). *The Synchronized Aggregation of Beliefs and Probabilities*. Conference. Presentation (contributed). European Epistemology Network (EEN) 2016. EHESS: Institut Jean-Nicod, CNRS, Paris IV.
- Feldbacher-Escamilla, Christian J. (2016-03-08/2016-03-11). *The Synchronized Aggregation of Beliefs and Probabilities*. Conference. Presentation (contributed). GWP.2016. University of Duesseldorf: GWP & DCLPS.

# Introduction

Classical epistemology and philosophy of science: individual belief, degrees of belief, justification, knowledge, . . .

Social epistemology and modern approaches in the *pos*: consideration also of collective/group agency;

Relevant topics:

- bridging degrees of belief and belief (also: 'binarization')
- bridging individual beliefs/degrees of belief and collective ones

Here we consider bridging degrees of belief and belief in a collective setting:  
Are they synchronized?

# Contents

- 1 BB: Belief Binarization
- 2 JA: Judgement Aggregation
- 3 BB+JA

# BB: Belief Binarization

## Intro

Two important notions: *Bel* and *Pr*

**(Bel)**

$Bel(\top)$ ,  $\neg Bel(\perp)$ ,

$Bel(\varphi)$  and  $\varphi \vdash \psi \Rightarrow Bel(\psi)$ ,

$Bel(\varphi) \& Bel(\psi) \Rightarrow Bel(\varphi \& \psi)$

**(Pr)**

$Pr(\top) = 1$ ,  $Pr(\varphi) \geq 0$ ,

$\varphi \not\vdash \psi \Rightarrow Pr(\varphi \vee \psi) = Pr(\varphi) + Pr(\psi)$ ,

$Pr(\psi) > 0 \Rightarrow Pr(\varphi|\psi) = \frac{Pr(\varphi \& \psi)}{Pr(\psi)}$

*Lockean* Bridging:

$$\text{(L)} \quad Bel(\varphi) \Leftrightarrow Pr(\varphi) \geq r \geq \frac{1}{2}$$

E.g.: You believed 'Hillary Clinton will be ...', because ... there was no alternative ...

# The Lottery Paradox

Henry Kyburg's well-known example (1961):

Assume:

- $Pr(t_1 = w) = \dots = Pr(t_{1.000.000} = w) = \frac{1}{1.000.000}$
- $Pr(t_1 = w) + \dots + Pr(t_{1.000.000} = w) = 1$

Then, by help of (Bel), (Pr), (L) we get:

- We get  $Bel(t_1 = w \vee \dots \vee t_{1.000.000} = w)$
- But also  $Bel(t_1 \neq w) \& \dots \& Bel(t_{1.000.000} \neq w)$
- And by  $\&$ -closure:  $Bel(t_1 \neq w \& \dots \& t_{1.000.000} \neq w)$
- Hence, again by  $\&$ -closure:  $Bel(\perp)$ , hence  $\downarrow$

So, at least at first glance, (Bel), (Pr), (L) seem to be incompatible.

# STB: The Stability Theory of Belief

Hannes Leitgeb's stability approach (2014):

Two principles:

- ① Re-interpretation of the scopes of the hidden quantifiers in (L):  
Instead of  $\exists r \forall Pr(L)$  assume  $\forall Pr \exists r(L)$
- ② Fit  $r$  (relevantly  $< 1$ ) to your set of beliefs by a stability constraint:

$\varphi$  is *Pr-stable-r* iff for all  $\psi$ :  $\varphi \not\# \psi \Rightarrow Pr(\varphi|\psi) \geq r$

Leitgeb's adequacy-result: The representation theorem:

Theorem (cf. Leitgeb 2014, p.140)

*(Bel), (Pr), (L) iff (Bel) is Pr-stable-r axiomatizable.*



# The STB-Solution to the Paradox

It explains our intuitions on

- 'Surely ticket  $t_i$  wont win.', and
- 'Surely some ticket will win.'

by reference to different contexts:

- Context:  $t_i \neq w$  **vs.**  $t_1 = w \vee \dots \vee t_{i-1} = w \vee t_{i+1} = w \vee t_{1.000.000} = w$   
 Solution: *Pr*-stable axiomatizable is  $Bel(\textcircled{2})$ , but also  $Bel(\textcircled{1} \ \& \ \textcircled{2})$ .
- Context:  $t_1 = w$  **vs.** ... **vs.**  $t_i = w$  **vs.** ... **vs.**  $t_{1.000.000} = w$   
 Solution: *Pr*-stable axiomatizable is only  $Bel(\textcircled{3} \vee \textcircled{2})$ .

## Some Problems of the STB-Solution

Main discussions on STB are about:

- the context-sensitivity of the choice of  $r$
- the limited possibilities for  $Bel$  – for further impossibility results cf. (Rott)

## Further Application of STB

Nevertheless, STB seems to bring about the right results also when applied to further specifications of (Bel) and (Pr).

Take, e.g., revision:

- for the domain of *Bel* we have principles of *belief revision*, the AGM postulates, connecting  $Bel_{new}$  with  $Bel_{old}$
- for the domain of *Pr* we have principles of Bayesian update: conditionalization, connecting  $Pr_{new}$  with  $Pr_{old}$

Here *Pr*-stability is preserved (cf. Leitgeb 2013);

But what about aggregation? Is *Pr*-stability also preserved among aggregations from individual beliefs/degrees of belief to collective ones?

# JA: Judgement Aggregation

## Intro

The problem of judgement aggregation:

	$\varphi$	$\psi$	$\chi$
$Bel_1/Pr_1$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$
$Bel_2/Pr_2$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$
$Bel_3/Pr_3$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$	$\{0, 1\}/[0, 1]$
$Bel_{\{1,2,3\}}/Pr_{\{1,2,3\}}$	?	?	?

Qualitatively:  $Bel_{\{1,2,3\}} = aggr(Bel_1, Bel_2, Bel_3)$

Quantitatively:  $Pr_{\{1,2,3\}} = aggr(Pr_1, Pr_2, Pr_3)$

Problem: Characteristics of  $aggr$ ?

# Minimal Conditions for JA I

Minimal requirements for aggregating beliefs and degrees of beliefs in groups of size  $n$  are (cf. List&Pettit 2002):  $aggr : Bel^n / Pr^n \longrightarrow Bel / Pr$  with:

- **(U)** Universality:  $aggr$  allows as input any  $Bel, Pr$  satisfying (Bel), (Pr).
- **(A)** Anonymity:  $aggr$  cannot identify any specific input

$aggr(Bel_1, \dots, Bel_n) = aggr(Bel_1, \dots, Bel_n, Bel_{n-1}) = \dots$ ; similarly for the aggregation of  $Pr$ ;

# Minimal Conditions for JA II

Furthermore,  $aggr$  is systematic (transparent):

- **(S)** Systematizity:  $aggr$  is functional an propositionwise

$$Bel_{\{1, \dots, n\}}(\varphi) = aggr^*(Bel_1(\varphi), \dots, Bel_n(\varphi))$$

where  $aggr^*(Bel_1(\varphi), \dots, Bel_n(\varphi)) = aggr(Bel_1, \dots, Bel_n)(\varphi)$ ;

similarly for  $Pr$ ;

## Impossibility: Beliefs

Take, e.g.:

	$\varphi$	$\psi$	$\varphi \ \& \ \psi$
$Bel_1$	1	1	1
$Bel_2$	1	0	0
$Bel_3$	0	1	0
$Bel_{\{1,2,3\}}$	1	1	0

Here an aggregation by majority voting ( $Bel_{\{1,2,3\}}$ ) produces an incoherent result.

A general impossibility result:

Theorem (cf. List&Pettit 2002)

*(Bel), (U), (A), (S) are not jointly satisfiable by any aggr.*



## Impossibility: Degrees of Belief

Considering a further constraint:

- **(IP)** Independence Preservation: *aggr* preserves probabilistic independences in groups

I.e.: If  $Pr_i(\varphi|\psi) = Pr_i(\varphi)$  ( $1 \leq i \leq n$ ), then also  $aggr(Pr_1, \dots, Pr_n)(\varphi|\psi) = aggr(Pr_1, \dots, Pr_n)(\varphi)$ ;

one also ends up with an impossibility result for degrees of belief:

Theorem (cf. Lehrer&Wagner 1983)

*(Pr), (U), (A), (S), (IP) are not jointly satisfiable by any aggr.*

# Solutions

Solutions to these problems are:

- Vs. (U) by domain restriction (e.g. by ensuring convergence)
- Vs. (A) by favouring, e.g., expert judgements
- Vs. (S) by structuring the propositions before the aggregation (e.g. premise-based approach)
- Vs. (IP) by accepting different update behaviour
- Vs. the choice of a single *aggr* by a purpose dependent choice of different *aggrs*

One might ask whether BB, especially STB, provides some help in figuring out further solutions (e.g. vs. (U))?

But also, as questioned above: Is *Pr*-stability-*r* synchronizing  $Bel_{\{1,\dots,n\}}$  and  $Pr_{\{1,\dots,n\}}$ ?

BB+JA

# Intro

A short upshot:

- BB: *Bel* and *Pr* can be bridged by *L*, if *Bel* is *Pr*-stable-*r* axiomatizable.
- JA: Some properties within a group cannot be preserved generally in collective judgements: e.g., (IP), given (Pr), (U), (A), (S);
- BB+JA: Is *Pr*-stability-*r* preserved in collective judgements?

## Two Types of Stability in JA

In JA  $Pr$  may vary among the members of a group.

But also  $r$  might vary. Depending on variation we may distinguish two types of stability-preservation ( $1 \leq i \leq n$ ):

- Global:  $Bel_i$  is  $Pr_i$ -stable- $r$  axiomatizable.
- Local:  $Bel_i$  is  $Pr_i$ -stable- $r_i$  axiomatizable.

## Stability Preservation as a Desideratum in JA?

One might ask why universal properties of individual beliefs/degrees of belief should be preserved in pooling them?

A general answer might be seen in the *maximization* of individual interests and by this also the increased acceptability of a pooling result.

So, a general pooling-maxim might be: If each  $Bel_i$  or  $Pr_i$  has property  $Q$ , then also  $aggr(Bel_1, \dots, Bel_n)$  or  $aggr(Pr_1, \dots, Pr_n)$  should have  $Q$ .

E.g.: (IP); in case of comparability one might prefer that aggregation method that maximizes the preservation of universal properties.

## Local Stability Preservation

The explicit formulation of the local stability preservation constraint is as follows:

- **(LSP)** Local Stability Preservation: If  $Bel_i$  can be  $Pr_i$ -stable- $r_i$  axiomatized ( $1 \leq i \leq n$ ; for some  $r_1, \dots, r_n < 1$ ), then also  $aggr(Bel_1, \dots, Bel_n)$  can be  $aggr(Pr_1, \dots, Pr_n)$ -stable- $r$  axiomatized (for some  $r < 1$ ).

One can observe that:

### Observation

*(Bel), (Pr), (LSP) is not generally satisfied by aggr.*

## Global Stability Preservation

The explicit formulation of the global stability preservation constraint is as follows:

- **(GSP)** Global Stability Preservation: If there is a unique  $Pr_i$ -stable- $r$  axiomatization of  $Bel_i$  ( $1 \leq i \leq n$ ), then also  $aggr(Bel_1, \dots, Bel_n)$  can be  $aggr(Pr_1, \dots, Pr_n)$ -stable- $r$  axiomatized.

One can observe that:

### Observation

*(Bel), (Pr), (GSP) is satisfied by any linear aggr.*

(where such a method can always be described by  $aggr(Pr_1, \dots, Pr_n)(\varphi) = \sum_{1 \leq i \leq n} w_i \cdot Pr_i(\varphi)$ )



# Summary

- One candidate for belief binarization or bridging: STB
- STB has some faults, but seems to be quite natural inasmuch as stability is preserved among classical solutions for the different domains
- E.g.: Belief revision and Conditionalisation
- This continues also in the social setting: GSP

# References I

- Kyburg (Jr.), Henry (1961). *Probability and the Logic of Rational Belief*. Middletown: Wesleyan University Press.
- Leitgeb, Hannes (2013). "Reducing Belief Simpliciter to Degrees of Belief". In: *Annals of Pure and Applied Logic* 164.12. Logic Colloquium 2011, pp. 1338–1389. DOI: 10.1016/j.apal.2013.06.015.
- (2014). "The Stability Theory of Belief". In: *Philosophical Review* 123.2, pp. 131–171. DOI: 10.1215/00318108-2400575.
- List, Christian and Pettit, Philip (2002). "Aggregating Sets of Judgments: An Impossibility Result". In: *Economics and Philosophy* 18.01, pp. 89–110.

# Appendix

Ad (GSP):

- Assume  $Pr_i$ -stability- $r$  amongst the group.
- Then, there is a  $\varphi$  such that for any  $\psi$ :  $Pr_i(\varphi|\psi) \geq r$ .
- Since linear opinion pooling is convex, we get  $aggr(Pr_1, \dots, Pr_n)(\varphi|\psi) \geq r$ .
- Hence,  $\varphi$  is also  $aggr(Pr_1, \dots, Pr_n)$ -stable- $r$ .