

Binary Aggregation with Integrity Constraints

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An Outline

Introduce the framework of binary aggregation with integrity constraints, giving two crucial definitions: **paradox** and **collective rationality**.

1. BA with IC is a general framework for the study of **aggregation paradoxes**:
 - Preference and judgment aggregation are instances of BA with IC
 - Classical paradoxes falls under our general definition
2. BA with IC provides **general impossibility results**:
 - Prove characterisation results linking collective rationality and axioms
 - Obtain (im)possibility results in preference and judgment aggregation
3. Conclusion and directions for future research

Binary Aggregation

Ingredients:

- A finite set N of individuals
- A finite set $\mathcal{I} = \{1, \dots, m\}$ of **issues**
- A boolean *combinatorial domain*: $\mathcal{D} = D_1 \times \dots \times D_m$ with $|D_i| = 2$

Definition

An aggregation procedure is a function $F : \mathcal{D}^N \rightarrow \mathcal{D}$ mapping each profile of ballots $\underline{B} = (\underline{B}_1, \dots, \underline{B}_n)$ to an element of the domain \mathcal{D} .

Wilson (1975), Rubinstein and Fishburn (1986), Dokow and Holzman (2005)

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Example: Three bills

- $N = \{a_1, a_2, a_3\}$
- $\mathcal{I} = \{1, 2, 3\}$ one issue for every bill
- Individuals submit ballots in $\mathcal{D} = \{0, 1\}^3$

$B_1 = (0, 1, 0)$ the first individual accepts only the second bill.

Integrity Constraints

A **propositional language** \mathcal{L} to express integrity constraints:

- One propositional symbol for every issue: $PS = \{p_1, \dots, p_m\}$
- \mathcal{L}_{PS} closing under connectives $\wedge, \vee, \neg, \rightarrow$ the set of atoms PS

$IC \in \mathcal{L}$ expresses properties of ballots $B \in \mathcal{D} = \{0, 1\}^m$
Given an integrity constraint $IC \in \mathcal{L}_{PS}$, a **rational** ballot is $B \in \text{Mod}(IC)$

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Example: Three bills with budget constraint.

Two bills between b_1, b_2 and b_3 have to be approved/disproved
Budget constraint: $IC = \neg(p_1 \wedge p_2 \wedge p_3)$, there is budget only for two of them

Individual 1 submits $B_1 = (1, 1, 0)$: B_1 satisfies IC ✓

Individual 2 submits $B_2 = (0, 1, 1)$: $B_2 \models IC$ ✓

Individual 3 submits $B_3 = (1, 0, 1)$: $B_3 \models IC$ ✓

Majority aggregation approves all three bills: IC **not** satisfied!

Paradoxes and Collective Rationality

Every individual satisfies the **same** rationality assumption IC...
...what about the collective outcome?

Definition

A **paradox** is a triple (F, \underline{B}, IC) , where F is an aggregation procedure, $\underline{B} = (B_1, \dots, B_n)$ a profile, $IC \in \mathcal{L}_{PS}$ an integrity constraint, and $B_i \models IC$ for all $i \in \mathcal{N}$ but $F(\underline{B}) \not\models IC$.

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Definition

F is **collectively rational (CR)** for $IC \in \mathcal{L}_{PS}$ if for all profiles \underline{B} such that $B_i \models IC$ for all $i \in N$ then $F(\underline{B}) \models IC$.

F **lifts** the rationality assumption given by IC
from the individual to the **collective** level.

Axioms for Binary Aggregation

Classical axioms from social choice theory can be translated in this framework:

Unanimity (U): For any profile $\underline{B} \in X^N$ and any $x \in \{0, 1\}$, if $\underline{B}_{i,j} = x$ for all $i \in N$, then $F(\underline{B})_j = x$.

Independence (I): For any issue $j \in \mathcal{I}$ and any two profiles $\underline{B}, \underline{B}' \in X^N$, if $\underline{B}_{i,j} = \underline{B}'_{i,j}$ for all $i \in N$, then $F(\underline{B})_j = F(\underline{B}')_j$.

Neutrality ($N^{\mathcal{I}}$)...

New axioms can be defined like the following generalisation of **May's neutrality**:

Domain-Neutrality ($N^{\mathcal{D}}$): For any two issues $j, j' \in \mathcal{I}$ and any profile $\underline{B} \in X^N$, if $\underline{B}_{i,j} = 1 - \underline{B}_{i,j'}$ for all $i \in N$, then $F(\underline{B})_j = 1 - F(\underline{B})_{j'}$.

Part I:
A general definition of paradox

Preference Aggregation

Linear order $<$
over alternatives \mathcal{X} \Leftrightarrow Ballot B_{\leq} over issues
 $\mathcal{I} = \{ab \mid a \neq b \in \mathcal{X}\}$

Property of **linear orders** enforced with $IC_{<}$:

Completeness and irreflexivity:

$p_{ab} \vee \neg p_{ba}$ for $a \neq b \in \mathcal{X}$ $\neg p_{aa}$ for all $a \in \mathcal{X}$

Transitivity: $p_{ab} \wedge p_{bc} \rightarrow p_{ac}$ for $a, b, c \in \mathcal{X}$ pairwise distinct

Social welfare
function \Leftrightarrow Binary aggregation proc.
CR with respect to $IC_{<}$

Axioms are preserved: unanimity, IIA, neutrality...

Condorcet Paradox

	<i>ab</i>	<i>bc</i>	<i>ac</i>
Agent 1	1	1	1
Agent 2	0	1	0
Agent 3	1	0	0
Majority	1	1	0

Our definition of paradox:

- F is issue by issue majority rule
- the profile is the one described in the table
- **IC that is violated** is $p_{ab} \wedge p_{bc} \rightarrow p_{ac}$

Judgment Aggregation

Judgment sets J
over agenda Φ \Leftrightarrow Ballot B_J over issues
 $\mathcal{I} = \Phi$

Property of **judgment sets** enforced with IC_Φ :

Completeness: $p_\alpha \vee p_{\neg\alpha}$ for all $\alpha \in \Phi$

Consistency: $\neg(\bigwedge_{\alpha \in S} p_\alpha)$ for every mi-set $S \subseteq \Phi$

Complete and consistent
JA procedures for Φ \Leftrightarrow Binary aggregation proc.
CR with respect to IC_Φ

Different from Dokow and Holzmann: no focus on models of judgment sets.

Doctrinal Paradox

	α	β	$\alpha \wedge \beta$
Agent 1	1	1	1
Agent 2	0	1	0
Agent 3	1	0	0
Majority	1	1	0

Our definition of paradox:

- F is issue by issue majority rule
- profile described in the table
- **IC that is violated** is $\neg(p_\alpha \wedge p_\beta \wedge p_{\neg(\alpha \wedge \beta)})$

Ostrogorski Paradox

	E	V	I	P
Agent 1	0	1	0	0
Agent 2	0	1	0	0
Agent 3	1	0	0	0
Agent 4	1	1	1	1
Agent 5	1	1	0	1
Majority	1	1	0	0

Our definition of paradox:

- F is issue by issue majority rule
- **IC that is violated** is $P \leftrightarrow [(E \wedge V) \vee (V \wedge I) \vee (I \wedge E)]$

After some calculation IC is equivalent to:

$$(P \vee \neg E \vee \neg V) \wedge (P \vee \neg E \vee \neg I) \wedge (P \vee \neg I \vee \neg V) \wedge (\neg P \vee E \vee V) \wedge (\neg P \vee E \vee I) \wedge (\neg P \vee I \vee V)$$

Common feature: **clauses of size 3**

Part II: (Im)possibility results

General Characterisation Results

Given a list of **axioms** AX and a **language for integrity constraints** $\mathcal{L} \subseteq \mathcal{L}_{PS}$ we can define classes of aggregation procedures:

The class of aggregation procedures satisfying axioms AX:

$$\mathcal{F}_{\mathcal{L}}[\text{AX}] = \{F : \mathcal{D}^N \rightarrow \mathcal{D} \mid F \text{ satisfies AX on all } \mathcal{L}\text{-domains}\}$$

The class of procedures that **lift** integrity constraint in a given language is:

$$\mathcal{CR}[\mathcal{L}] = \{F : \mathcal{D}^N \rightarrow \mathcal{D} \mid F \text{ is CR for all IC } \in \mathcal{L}\}$$

What we want:

$$\mathcal{CR}[\mathcal{L}] = \mathcal{F}_{\mathcal{L}}[\text{AX}]$$

Some Characterisation Results

Cubes (conjunctions of literals) are lifted iff the procedure satisfies unanimity:

- $\mathcal{CR}[\text{cubes}] = \mathcal{F}_{\text{cubes}}[\text{Unanimity}]$.

The XOR-language is made of constraints of the form $p_i \leftrightarrow \neg p_j$:

- $\mathcal{CR}[\mathcal{L}_{\text{XOR}}] = \mathcal{F}_{\mathcal{L}_{\text{XOR}}}[\text{Domain-Neutral}]$
- There is no \mathcal{L} that characterises **anonymous** procedures.

Other results:

Umberto Grandi and Ulle Endriss. Lifting Rationality Assumptions in Binary Aggregation. In *Proceedings of the 24th AAI Conference on Artificial Intelligence (AAAI-2010)*, July 2010.

The Majority Rule

Proposition

The majority rule is CR with respect to IC if and only if IC is equivalent to a conjunction of clauses of size ≤ 2 .

Proof: Translate binary aggregation into judgment aggregation and use a theorem by Nehring and Puppe (majority rule is consistent iff there are no minimally inconsistent subsets of size less than 2 in the agenda).

Common feature of all paradoxes seen in Part 1:
clauses of size 3 are not lifted by majority

Impossibility Result in Preference Aggregation

Call a SWF **imposed** if there are two alternatives x and y such that x is collectively preferred to y in every profile:

Proposition

Any anonymous, independent and monotonic SWF for more than 3 alternatives and 2 individuals is imposed.

Proof sketch:

- to any A, I, M social welfare function corresponds an A, I and M binary aggregation procedure
- **characterisation result:** A, I, M aggregation procedures lift IC iff IC has a certain property or the acceptance quota for at least one issue is zero (i.e., the procedure is imposed)
- the integrity constraints $IC_{<}$ for preference aggregation **do not satisfy this property**

Part III: Conclusion and future work

Generalised Dictatorship

A **generalised dictatorship** copies the ballot of a (possibly different) individual (aka local dictatorships, positional dictatorships, rolling dictatorships):

Proposition

F is CR with respect to all IC in \mathcal{L}_{PS} if and only if F is a generalised dictatorship

This class includes:

- Classical dictatorships $F(B_1, \dots, B_n) = B_i$ for $i \in \mathcal{N}$
- **Distance-based generalised dictatorship**: map (B_1, \dots, B_n) to the ballot B_i that minimises the sum of the Hamming distance to the others (a sort of “median voter” ...). An interesting procedure!

Future work: how this procedure relates to existing distance based procedures?

General Combinatorial Domains

- Domain of aggregation: $\mathcal{D} = D_1 \times \cdots \times D_m$
- Language on atomic propositions $\{x_j = a \mid j = 1, \dots, m \text{ and } a \in D_j\}$
- Integrity constraint for **approval voting**:

$$\bigwedge_{j=1, \dots, m} \bigvee_{a \in D_j} x_j = a$$

IC for majority rule: more complex...

Examples of an interesting constraints (voting for committees):

- $\neg(x_1 = a \wedge x_2 = c \wedge x_3 = d)$ – incompatibility of a committee
- $x_1 = a \wedge x_2 = a \rightarrow (x_3 = b \vee x_3 = c \vee x_4 = d)$ – minority representation

Future work: Characterisation results can be used for this framework to produce interesting results? What is the notion of paradox here?

Preferential Dependencies

Several representation languages for preferences over combinatorial domains express **preferential dependencies**:

- CP-nets (Boutilier et Al, 2004)
- Prioritized goals (Lang, 2004)
- PL (Bienvenue, Lang and Wilson, 2010)
- ...

Preferential dependencies are **binary objects** (e.g., graphs)

Future work:

- Aggregate dependencies using binary aggregation (taking care of eventual ICs on individual preferential dependencies)
- Formulate a **clustering** of issues or a **voting agenda** for sequential elections based on collective preferential dependencies

Conclusion

Binary aggregation with integrity constraints:

- **language** to express rationality assumptions
- concept of **collective rationality** with respect to an IC
- general framework for **paradoxes** (e.g., Condorcet and doctrinal)
- **characterisation** results relating languages and axioms
- new proof method for impossibility results: **clash between axioms and IC**

Bigger picture:

- **Axiomatic Method**: derive (im)possibility results for specific domains and specific axioms
- **"AI approach"**: devise a machinery to reason about different application-specific domains, assumptions, axioms