

# Meaningful, Useful and legitimate information

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# Outline

- 1 Motivations
- 2 The problem
- 3 Relevance

# Why do we care?

- Decisions are based on information.
- We usually call this “evidence”.
- Not any “evidence” is relevant, appropriate or acceptable.
- How do we construct “relevant” evidence for a decision process?

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Under which conditions

such sentences make any sense for the decision process?

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We consider as empirical observations:

- Binary relations related to comparisons
- Measures performed on well known measurement scales
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We trust our sources and we do not consider unstructured information such as:

- Images/videos/streaming
- Texts/Narratives/Stories
- Maps/Geography

# What is the problem?

- From empirical observations to measures.
- From diverse empirical observations performed jointly to measures and thus to a measure.
- From measures to sentences (summarising the observations and/or the measures).
- From summarised sentences to suggested decisions (recommendations).

## More formally

If  $O$  is a set of empirical observations,  $M$  is a set of measures,  $\varphi$  is a sentence and  $\psi$  is a suggested decision

- Under which conditions  $M$  is consistent with  $O$ ?
- How to define the notions of  $\models_m$ ,  $\models_u$  and  $\models_l$  standing for meaningful, useful and legitimate inference?
- How to check questions of the type  $O \models_m \varphi$  or  $M \models_l \psi$ ?

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If  $\models_i$   $i \in \{m, u, l\}$  stands for the different types of inference previously introduced

How do we define and check that  $\varphi \models_i \psi$ ?

# Relevance

Relevant evidence ought be:

- true
- meaningful
- useful
- legitimate

## Theorem

*The four conditions of truthfulness, meaningfulness, usefulness and legitimacy are independent*

# Truthness

All convicted felons eat bread: eating bread is criminogenic

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Yesterday we had 20C, while today 10C: it is 50% less warm

Is this sentence true?



# Meaningfulness

Given a set of measures

a sentence derived from such measures is meaningful if its truthness is independent from any admissible transformation of the measurement scale.

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$BMI(x) = \frac{W(x)}{H^2(x)}$ . Suppose

$W(x) = 50$ ,  $H(x) = 1.5$ ,  $W(y) = 120$ ,  $H(y) = 1.65$ , then

$BMI(x) = 22$ ,  $BMI(y) = 44$ : therefore the risk of cardiovascular accident is double

This sentence is meaningful, but is not true, since it has never been proven that the risk is proportional.

# Meaningfulness 2

## Manipulations

Any type of manipulation of numerical information needs to respect the admissible transformations property. In this case we talk about meaningful manipulations.

# Example

$$x \succ y \succ z \succ w \succ t$$
$$\frac{f(t) \quad f(w) \quad f(z) \quad f(y) \quad f(x)}{}$$

# Example

$x \succ y \succ z \succ w \succ t$

	$f(t)$	$f(w)$	$f(z)$	$f(y)$	$f(x)$
L1	1	2	3	4	5

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L2	1	2	3	4	10

# Example

$x \succ y \succ z \succ w \succ t$

	$f(t)$	$f(w)$	$f(z)$	$f(y)$	$f(x)$
L1	1	2	3	4	5
L2	1	2	3	4	10

The mean of L1 is 3 and the mean object is  $z$ . The mean of L2 is 4 and the mean object is  $y$ . The median instead is always  $z$  independently from any numerical coding of the ordinal scale.

A mean is meaningless in presence of ordinal information, while a median is meaningful.



# Usefulness

Can we have meaningful sentences which are useless?

Example:

pollutant	CO <sub>2</sub>	SO <sub>2</sub>	O <sub>3</sub>	dust
$t_1$	3	5	8	6

The air quality is 8 and therefore we need to launch a warning to the population. This is meaningful and useful for a warning system.

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$t_1$	3	5	8	6
$t_2$	7	7	7	7
$t_3$	1	2	8	1

The air quality today is 8; with policy  $t_2$  reduces to 7, while with policy  $t_3$  remains 8. Therefore  $t_2$  is better than  $t_3$ . This is meaningful, but useless from a policy comparison perspective.

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An average of the four pollutants is meaningless,  
but far more useful from a policy comparison perspective

# Legitimacy

- Is a candidate chosen by the electoral system, but not from the majority of the population a legitimate winner?
- Is a racial statistic legitimate as evidence for a public policy?
- Is a gender statistic legitimate if it is binary?
- If the majority of the population (at the polls) prefers introducing the death penalty is this a legitimate reason for passing a bill?

# Is majority obvious?

Four candidates and seven examiners with the following preferences.

	a	b	c	d	e	f	g
A	1	2	4	1	2	4	1
B	2	3	1	2	3	1	2
C	3	1	3	3	1	2	3
D	4	4	2	4	4	3	4

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	a	b	c	d	e	f	g	B(x)
A	1	2	4	1	2	4	1	15
B	2	3	1	2	3	1	2	14
C	3	1	3	3	1	2	3	16
D	4	4	2	4	4	3	4	25

The Borda count gives  $B > A > C > D$

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B	2	3	1	2	3	1	2	14
C	3	1	2	3	1	2	3	15

If D is not there then  $A > B > C$ , instead of  $B > A > C$



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The Condorcet principle gives  $A > B > C > A$  !!!!

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is true, meaningful (if interval scales are used), useful, but not legitimate because manipulable.

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## The Condorcet method

is true, meaningful, legitimate, but useless because does not guarantee to provide a winner.

# Relevant Evidence

- Meaningfulness needs to be established with respect to some formal properties, axioms, a theory.
- Usefulness needs to be established with respect to a user/client and some purpose.
- Legitimacy needs to be established with respect to a context/culture/law.

# Conclusions

- Information needs to be rigorous: the result of some scientific elaboration of empirical observations.
- Don't play with numbers, pay attention to the semantics they carry.
- Always consider the purpose of the decision process and the long term consequences of the information provided.
- Always consider the stakeholders involved in the decision process and their legitimate expectations.