



Methods and Models for Decision Making

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God in 7 steps:

- A decision problem involve a choice
- Usually you have a “real” decision problem (and not an “ideal” one)
 - actors (conflicts)
 - criteria (trade-off)
 - lack of information
- There are tools for decision aiding
 - ↳ abstraction / analysis / synthesis

Index:

- (1) Introduction
- **(3) Mental models**
- (5) Classification
- (7) Ranking-2, multicriteria
- (9) Seminar
- (11) Group decision
- (13) Research topics
- (15) Conclusions
- (2) Tools & frame
- (4) Design & decision**
- (6) Ranking-1, risk analysis
- (8) A tentative case (discuss.)
- (10) Rating problems
- (12) Genetic alg. + ...
- (14) Case results (if any ...)

Mental models

Examples (Thaler, 1991)

- ① **Colorni** won $\begin{cases} 200 \text{ € (at a homely bingo)} \\ 800 \text{ € (at a parish bingo)} \end{cases}$
- Luè** won 1.000 € (at a Politecnico bingo)
- who is more satisfied ?
- ② **Colorni** has to pay $\begin{cases} 200 \text{ € for ICI (a house owner tax)} \\ 800 \text{ € for IVA (VAT tax)} \end{cases}$
- Luè** has to pay 1.000 € for IRPEF (another tax)
- who is less unhappy ?
- ③ **Colorni** has an accident and pays 800 €
but he has a reimbursement from the insurance 200 €
- Luè's** car has been striped, he has to pay 600 €
- who is less unhappy ?
- ④ **Colorni** receives a production bonus for 1.000 €
but he discovers a 300 € debt
- Luè** receives a production bonus for 700 €
- who is more satisfied ?

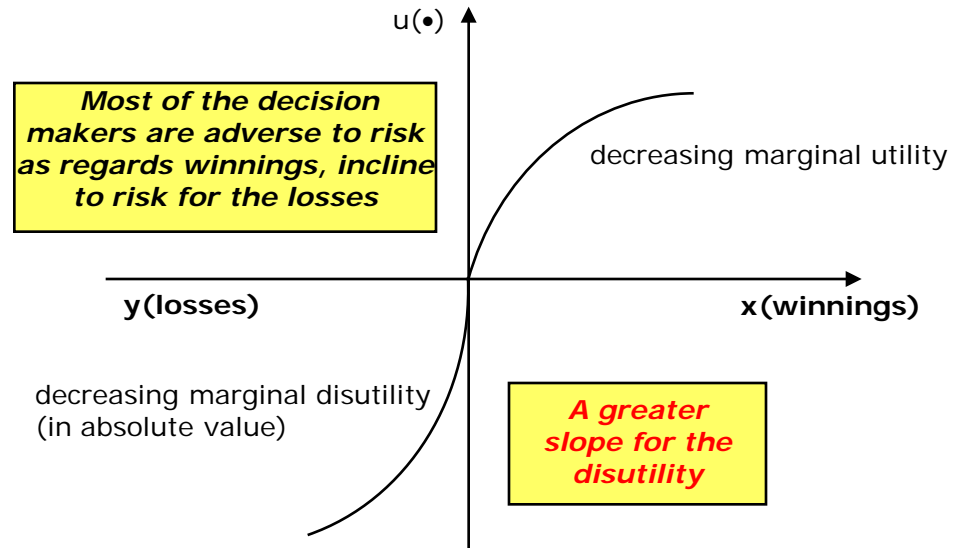
Mental models – 1

- 1 There is a dissociation for the **winnings**
- 2 There is an aggregation for the losses
- 3 There is a dissociation between **low winnings** and **high losses**
- 4 There is an aggregation between **high winnings** and **low losses**



Dissociation = overestimation
Aggregation = underestimation

A **subjective** utility function
(Bernoulli, S. Pietroburgo, 1738)



$$u(x_1 + x_2) < u(x_1) + u(x_2) \rightarrow \text{UTILITY}$$

$$u(y_1 + y_2) > u(y_1) + u(y_2) \rightarrow \text{DISUTILITY}$$

(warning ! values < 0)

Risk and perception – 1

- Protocol A** 20% immediate death
80% increase expected lifetime by 30 years
- Protocol B** 100% increase expected lifetime by 18 years

Better A or B ?

- Protocol C** 80% immediate death
20% increase expected lifetime by 30 years
- Protocol D** 75% immediate death
25% increase expected lifetime by 18 years

Better C or D ?

Anticancer therapy
on "group X" at European
Institute of Oncology (IEO)



Patients of about 40 years,
**with expected life of 3-6
months**

Risk and perception – 2

- **Group X** • → Only 1 patient in 4 reacts positively, then who react can choose between E and F

Protocol E 20% immediate death
80% increase expected lifetime by 30 years

Protocol F 100% increase expected lifetime by 18 years

Anticancer therapy
on "group X" at IEO

- Comment 1 → this situation (E-F) is the same of the previous one (C-D)
- Comment 2 → The decision-makers "clears" the information context (only 1 in 4 ...) and decides **between the proposed options**



The mental model may depend on the communication

(a) Objective probability (frequentist) \longrightarrow $p = f/t$

- \longrightarrow ratio of the number of favorable cases (f)
to number of total cases (t)
- \longrightarrow applicable only to problems with repeated events ∞ (many) times

(b) Subjective probability \longrightarrow $p = \dots (?)$

- \longrightarrow **personal** assessment of the ratio of favorable cases to total cases
- \longrightarrow everyone can assess its **own** probability to every casual event,
this represents his degree of confidence
 - \longrightarrow how can you measure this probability ?

▪ **Examples**

by means of a lottery



Random events: what probability ?

O = objective probability
S = subjective probability

1. Probability of having two pairs and changing one card ... O S
2. Probability that my number wins to the lottery "Lotteria Italia" O S
3. Probability of rain tomorrow in Milan O S
4. Probability that (having 60 years and being in good health) I will be alive in 20 years O S
5. Probability that, from a survey of 2000 people done before the elections, I guess the party who will govern Italy O S
6. Probability that if the avian influence hits Italy, the vaccine is effective O S
7. Probability that Soldatino wins the Gran Premio degli Assi a Tordivalle (Febbre da cavallo, 1982) O S
8. Other examples proposed by you ...

Axioms of probability theory

A1 - Probability $p(e)$ of an event (e): value between $\begin{matrix} < \\ 0 \text{ (impossible)} \\ & 1 \text{ (certain)} \end{matrix}$


A2 - Complementary probability (the event does not occur): $1-p(e)$

A3 - For events (e_1, e_2, \dots, e_k) that are mutually exclusive : $p(e_1 \text{ OR } \dots \text{ OR } e_k) = p(e_1) + \dots + p(e_k)$

A4 - For 2 independent events (e_1, e_2) : $p(e_1 \text{ AND } e_2) = p(e_1) * p(e_2)$

A5 - For 2 non-independent events (e_1, e_2):

└───> conditional probability
(Bayes, 1763)

$$p(e_1/e_2) = \frac{p(e_1 \text{ AND } e_2)}{p(e_2)}$$
$$= \frac{p(e_2/e_1) * p(e_1)}{p(e_2)}$$


A6 - If an event has an expected value v_0
then a sequence of n repetitions
has an expected value of $n * v_0$
(see Lottery L1)

An example follows

The barometer (an example)

w1 = good weather
w2 = bad weather

W = state of nature

	w1	w2
	.80	.20

p(w)

y1	.55
y2	.25
y3	.20

p(y)

	w1	w2
y1	.50	.05
y2	.20	.05
y3	.10	.10

p(w,y)

	w1	w2
	.91	.09
	.80	.20
	.50	.50

p(w/y)

y1 = clear
y2 = variable
y3 = rain

y1	.63	.25
y2	.25	.25
y3	.12	.50

p(y/w) → in this case does not make much sense

Lottery

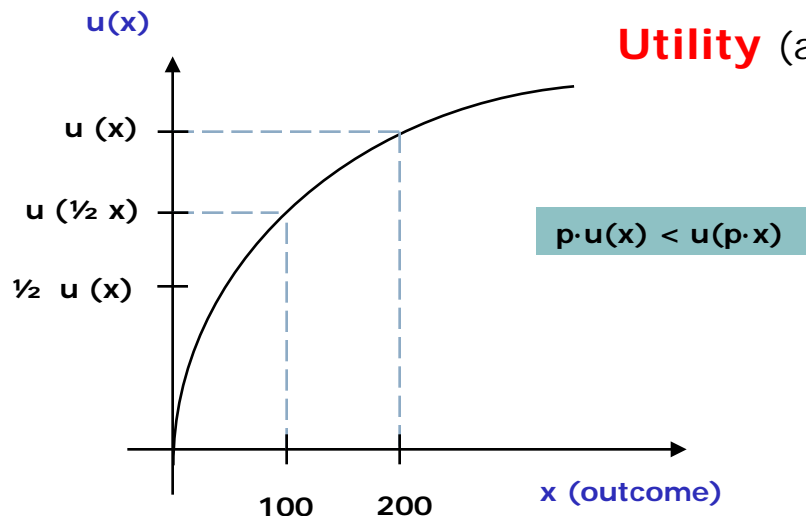
Given a ***certain event R1*** of which the decision-maker knows how to estimate the utility (that is, his level of satisfaction), if exists an ***uncertain event R2*** with a higher utility, the decision-maker is able to compare the utility of R1 (obtainable with certainty) with the ***equivalent utility*** of obtaining R2 with probability p and obtaining nothing (the null event) with probability $(1-p)$. ***Determining p*** is a prerogative of the decision-maker.

Utility (see following slide)

State of nature

The set of variables that are ***not controlled*** by the decision-maker, but that influence the final result (also known as "exogenous variables").

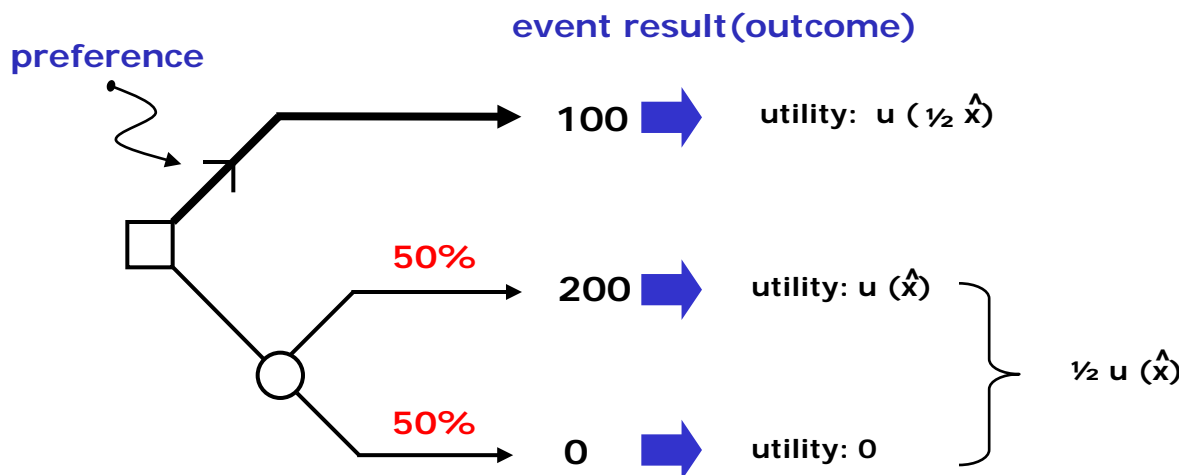
Expected value vs. Expected utility



RISK AVERSION: the decision-maker prefers certain **100 €** than the lottery with **200 €** at 50% and **0 €** to 50%



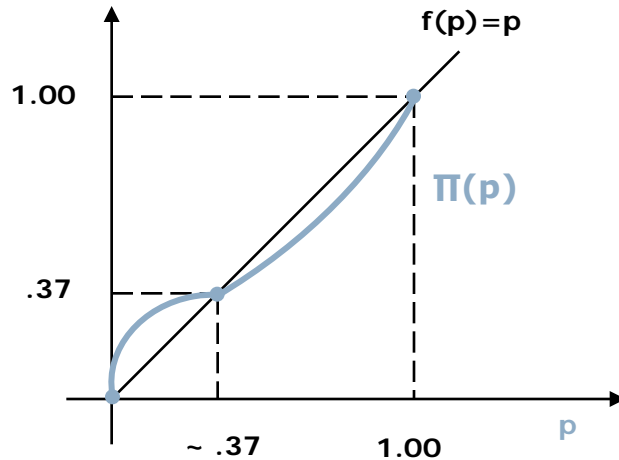
CERTANTY EQUIVALENT \bar{e} : value that makes the sure event \bar{e} equivalent to the lottery with x € at 50% and 0€ at 50%



- (i) $\bar{e} = 30$
 - (ii) $\bar{e} = 90$
- who is more risk-adverse ?

Mental models – 2

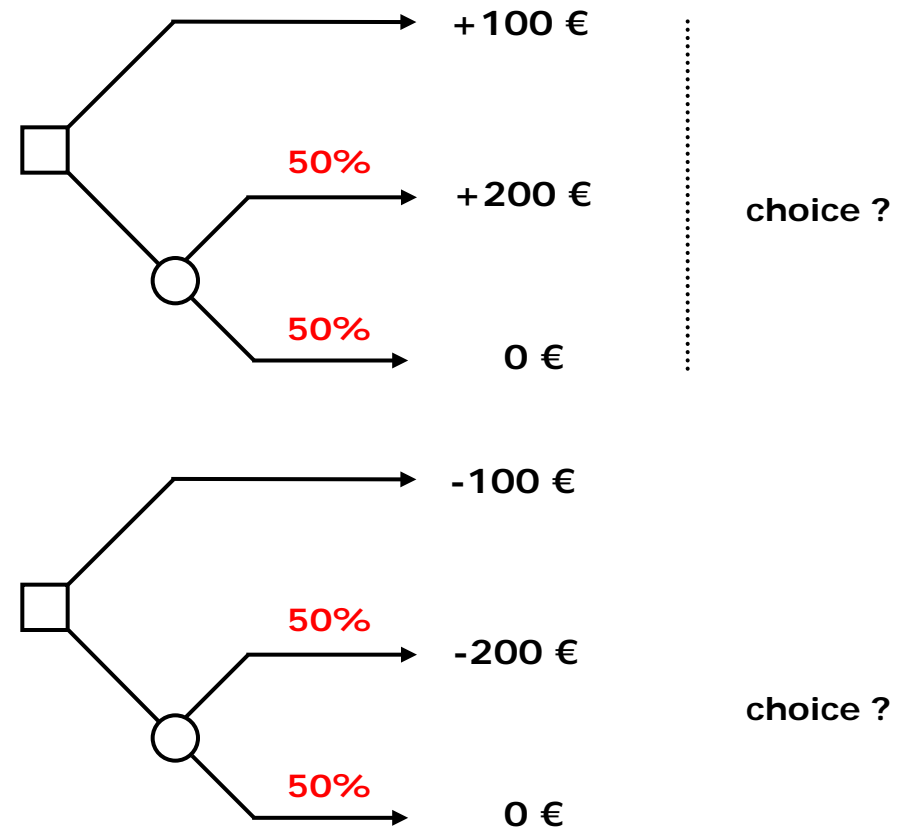
[Tversky & Kahneman]



Representation of the "mental" weight $\Pi(p)$ assigned to different probabilities p



- over-estimation of low p values
- under-estimation of high p values



- The majority of the decision makers is:
- risk-averse in case of winnings
 - risk-inclined in case of losses

Frame effect

- Avian influence (possible death)
- Group at risk: 600 people

[Protocol A	200 people will survive	}	Better A or B ?
	Protocol B	$\left\{ \begin{array}{l} \text{with } p=1/3 \text{ 600 will survive} \\ \text{with } p=2/3 \text{ nobody will survive} \end{array} \right.$		

[Protocol A	400 people will die	}	Better A or B ?
	Protocol B	$\left\{ \begin{array}{l} \text{with } p=1/3 \text{ nobody will die} \\ \text{with } p=2/3 \text{ 600 will die} \end{array} \right.$		

- Aversion to the risk in case of winnings
- Propensity for risk in case of losses

Choice vs. rejection

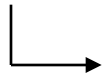
Shafir (1993)

Cause for divorce, with the choice for the custody of the only child



Parent A	Parent B
Average Income	High income
Normal health	Small health problems
Regular working hours	Many business trips
Acceptable relationship with the child	Very close relationship with the child
Stable social life	Extremely active social life

Group 1



Which parent would you give child's custody?

Group 2



Which parent would you reject the child's custody to?



Info on the parent B are strongly polarized

Example (more)

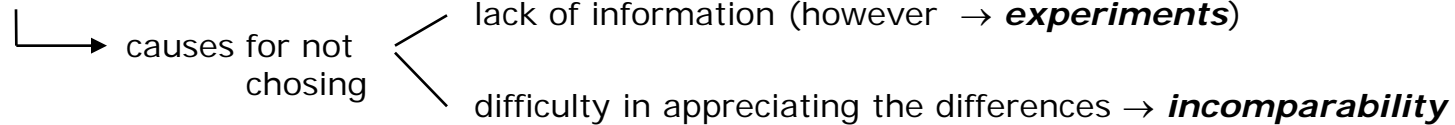
- **Preference** for an alternative vs. **Rejection** of an alternative

ONE BETWEEN MANY

ONE AGAINST MANY

- If  there are 2 alternatives  the two situations should coincide (but it is not always true)

- **Choice** vs **Non-choice**



Outranking methods (Electre)

- Often the difficulty of settling the conflict is overcome → introducing other alternatives (to facilitate the comparison)

Conclusions

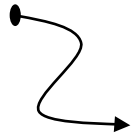
- Bibliography:

1. M. Piattelli Palmarini, "Psicologia ed economia delle scelte", Codice, 2005.

2. R. Rumiati, "Decidere", Il Mulino, 2000.

3. D. Kahneman, A. Tversky, "Choices, Values, and Frames", Cambridge Un. Press, 2000

- Test



TTTTTCCCCC
CTTCTTTCTT



which sequence is the most probable one?

which final result (T/C) is the most probable one?

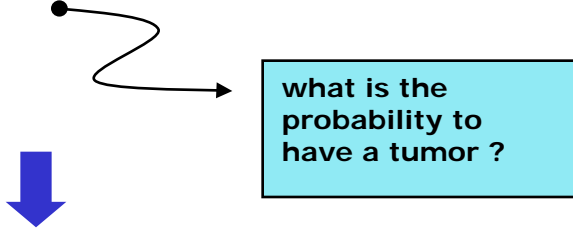
C: cross T: head

- Two problems

Two problems

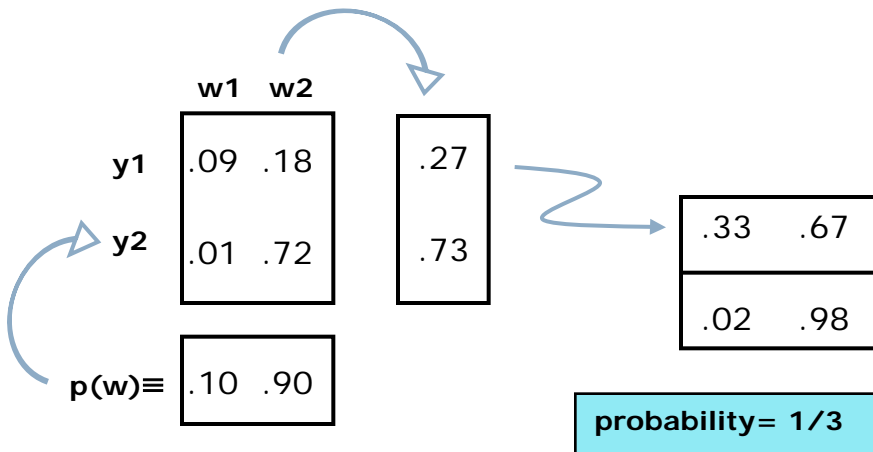
Example of Bayes

1. a woman at a doctor → nodule
2. examination → possible tumor (10 %)
3. mammography $\left\{ \begin{array}{l} \text{reliable at 90 \%} \\ \text{wrong answer at 20 \%} \end{array} \right.$
4. "positive" result

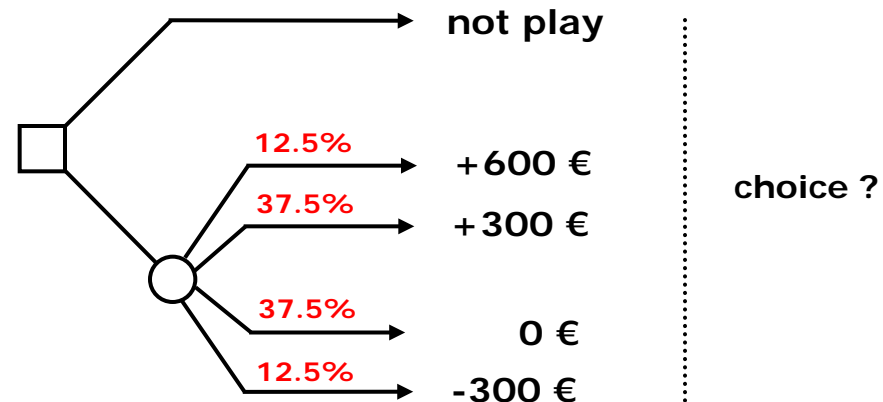
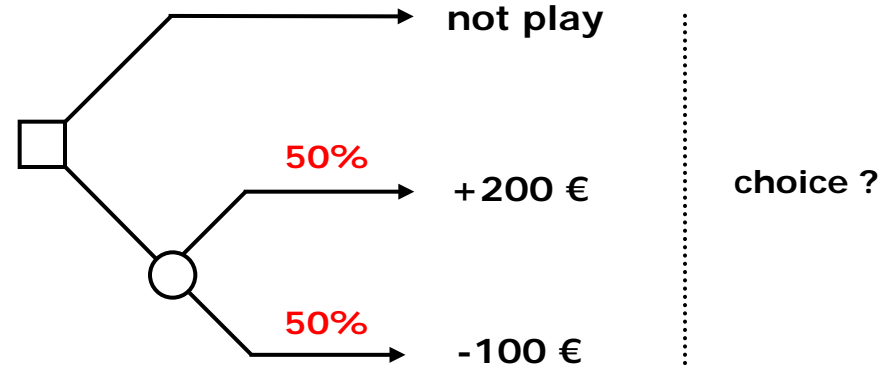


$y_1 = \text{positive result}$
 $y_2 = \text{negative result}$

$w_1 = \text{tumor}$
 $w_2 = \text{healthy}$



Example by Tversky (1992)



D & D
(Design & Decision)

Why Decision Aid (DA) in this context?

- Why Decision Aid (DA) in this context ?

- Design of what?
 - i. PRODUCT

 - ii. SERVICE

 - iii. PROCESS

 - iv. ... (other) ... ?

- The nail holder avoiding to hurt one's hand while hammering



the objective

- A great number of alternatives!



hand protection



fore - hole







...

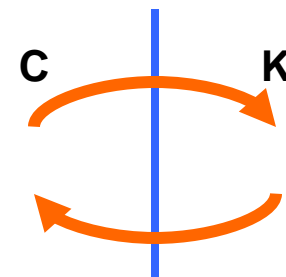
- From a large amount of knowledge to a (limited) set of alternatives

Focus → generating possible solutions

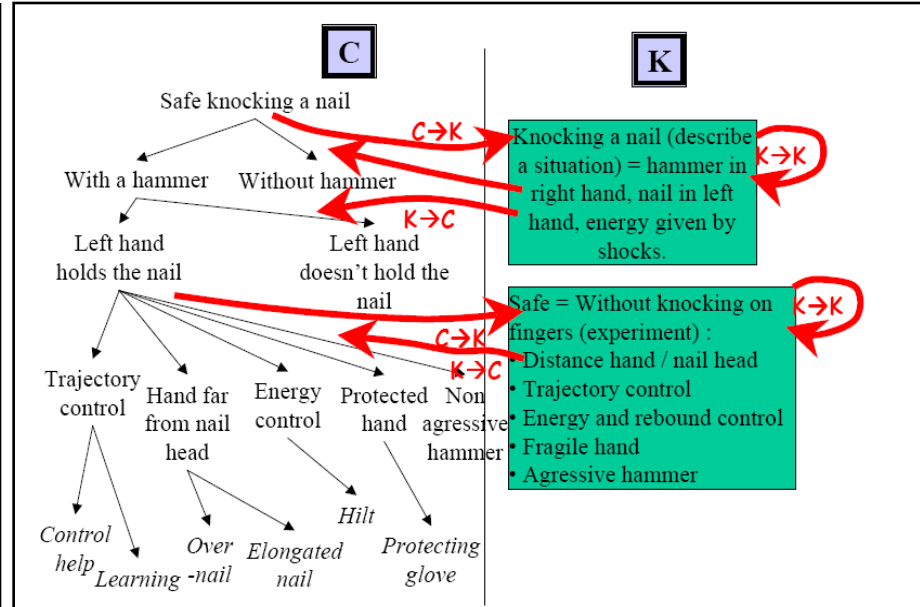
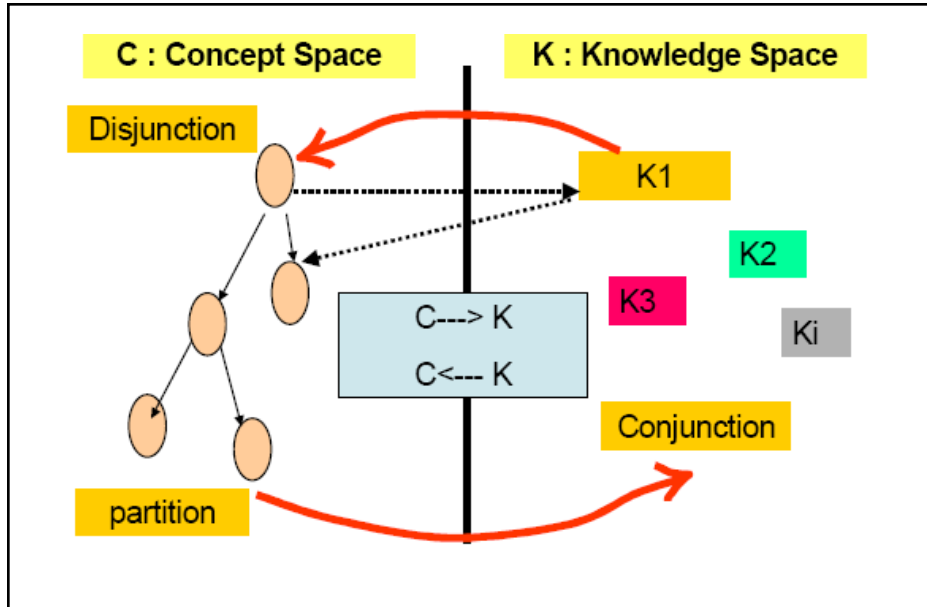
Case 1 – Knowledge vs Concept

- Knowledge  a set (space) of propositions that are true or false
- An object  defined by a set of attributes (and by their possible values)
- Space K  the cartesian product of the attributes
- Space C  a space where to *add/eliminate/change* the attributes

- From space K to space C and vice-versa



Case 1 – The C-K theory



➤ The C-K dynamics

➤ Nail holder phase 1-a...

[LINK](#)

Case 1 – A branch tree

- A node:

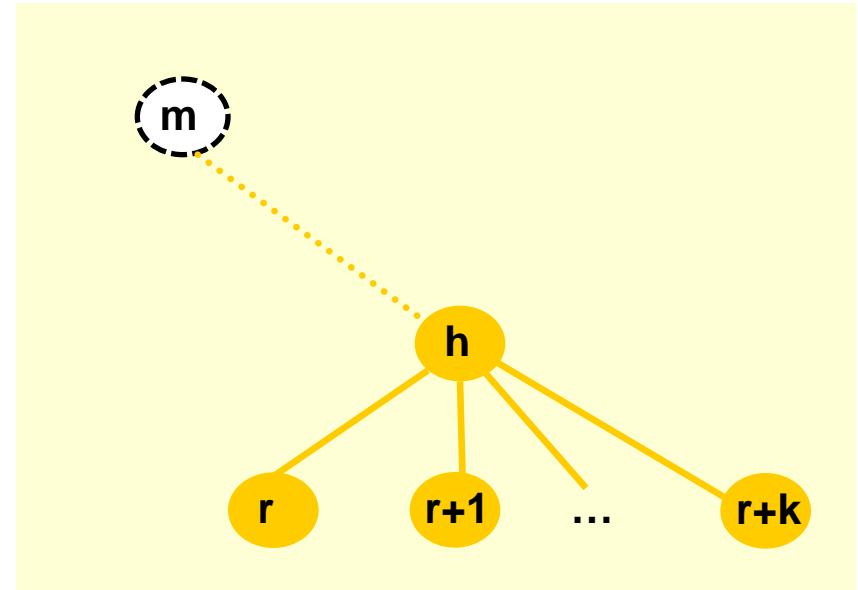
- ↳ a predecessor (father)
- ↳ more successors (children)

- In general

- ↳ a condition (constraint) is “inherited” by the father
- ↳ the children describe a partition of the “world”
represented in the node $(sol_r \cup sol_{r+1} \cup \dots \cup sol_{r+k} \equiv sol_h)$

- The role of the bounds

- ↳ B&B (branch and bound) methods



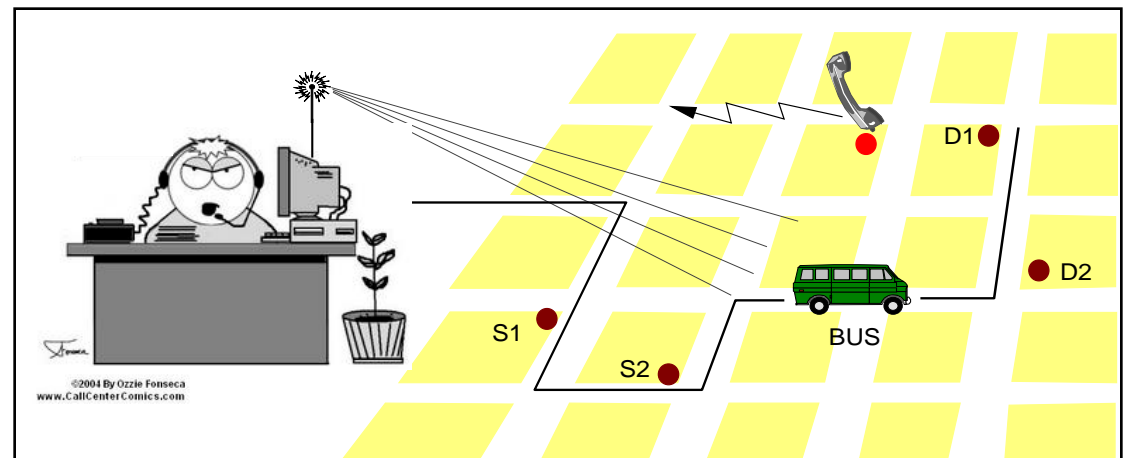
Case 2 - Service

- A (public) service for weak demand (irregular) mobility

↳ a condition

- A “dial-a-ride” system

- What is a good service?



↳ low cost ?

↳ high coverage ?

↳ quick door-to-door ?

↳ ...

Focus → different point of view

http://projectapps.vtt.fi/Connect/portal/alias_Rainbow/lang_en/tabID_3342/DesktopDefault.aspx

Case 2 – A specific ITS (intelligent transport system)

- **Dial-a-ride (DaR) service**
 - ↳ a trade-off between
 - public regular service
 - low cost
 - low flexibility
 - personal car (taxi)
 - high cost
 - high flexibility
- A classical balance between economics and quality
- DaR service:
 - ↳ when-where the demand appears
 - ↳ useful in situation of
 - weak demand
 - night hours
 - particular customers
 - ↳ safe (door-to-door)

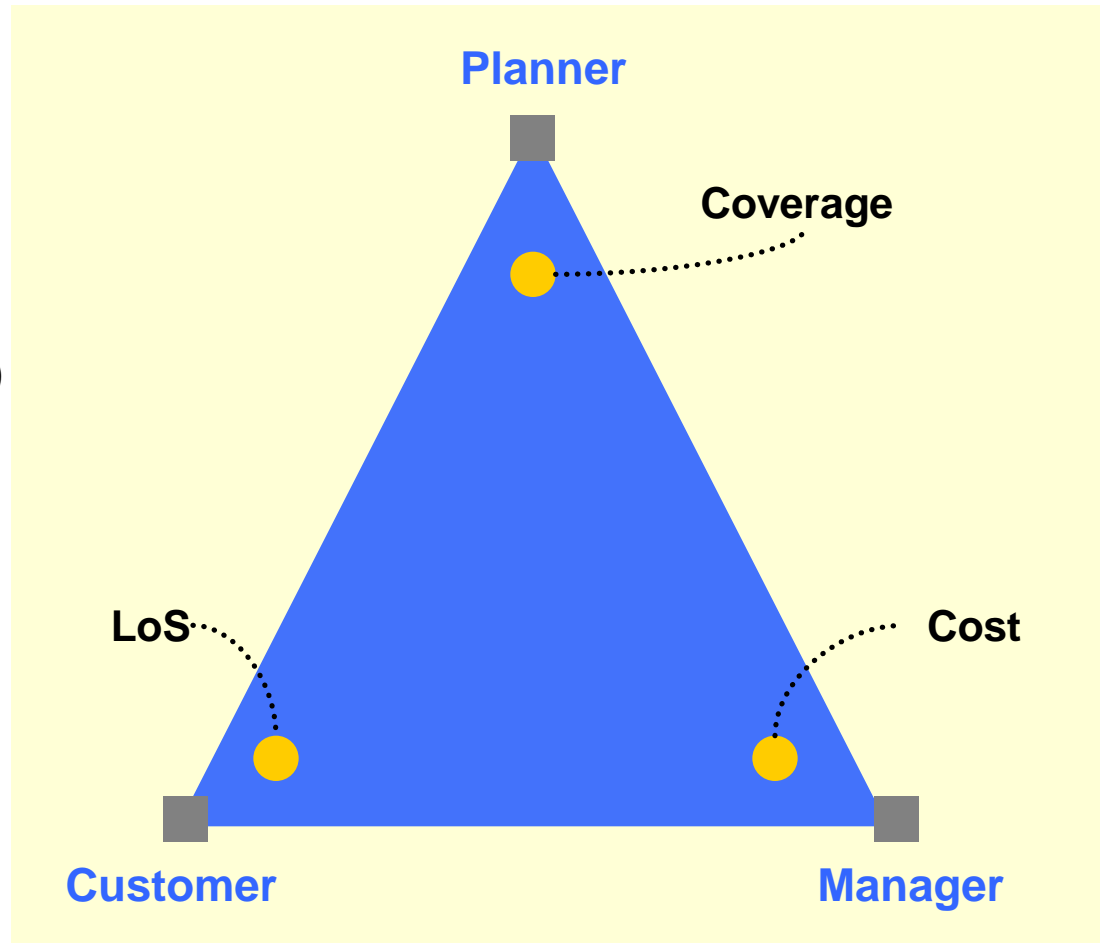
http://www.tempi.piacenza.it/prontobus/prontobus.asp#come_nasce_prontobus

Case 2 – The trade-off approach


- Three points of view:
 - the planner objective is the area coverage
 - the manager objective is the cost control
 - the customer objective is the Level of Service (LoS)


What measures ?

How compare them ?



Case 2 – The conceptual path

1. Definition of (multiple) objectives
2. Choice of the set of indicators (each with its measure unit)
3. Matrix of effects/impacts (quantitative and qualitative)
4. From indicators to utilities  the value functions (...)
5. Matrix of evaluation (values in a common scale)
6. ... (see in the following)

- The urban plan of a (small) town
- A set of coordinate actions  the need
- Identification of elementary actions
- Evaluation of the effects (costs, impacts, ...)

Focus → analysis of the combinations of (elementary) actions

- Example 1 → the value of the ***refugee suitcase***



- a set of items
- each item has a value and a weight
- the refugee can choose a subset of them
- there is a constraint of total weight supported
- how does the refugee choose ?

- Example 2 → the value of the ***beautycase***



- toothbrush (value v_b)
- toothpaste (value v_p)
- other objects (not important...)
- the value V of the beautycase
is the sum or ... ?

Case 3 – Accumulation (the sum operator)

- Model:

item	V_i	W_i
1	50	10
2	80	8
3	20	5
4	60	5

$$\max f = 50x_1 + 80x_2 + 20x_3 + 60x_4$$

$$10x_1 + 8x_2 + 5x_3 + 5x_4 \leq W$$

$$x_i = 0, 1$$

W (total weight supported) = 16

ADDITIVE
MODEL

- Decision aid: an algorithm

exact (2^4 combinations) (*)

heuristic (ranking by ...)

$$\left. \begin{array}{l} \text{item}_4 \rightarrow 60/5 = 12 \\ \text{item}_2 \rightarrow 80/8 = 10 \\ \text{item}_1 \rightarrow 50/10 = 5 \\ \text{item}_3 \rightarrow 20/5 = 4 \end{array} \right\}$$

then...

Case 3 – Combinatorics

values: 50, 80, 20, 60

weight: 10, 8, 5, 5 (W=16)

#	X ₁	X ₂	X ₃	X ₄	f
1	0	0	0	0	0
2	0	0	0	1	60
3	0	0	1	0	20
4	0	0	1	1	80
5	0	1	0	0	80
6	0	1	0	1	140
7	0	1	1	0	100
8	0	1	1	1	n.f.

#	X ₁	X ₂	X ₃	X ₄	f
9	1	0	0	0	50
10	1	0	0	1	110
11	1	0	1	0	70
12	1	0	1	1	n.f.
13	1	1	0	0	n.f.
14	1	1	0	1	n.f.
15	1	1	1	0	n.f.
16	1	1	1	1	n.f.




Case 3 – Synergy (some operators)

- A set Ω of elements
- A function f such that $\left[\begin{array}{l} \text{▪ } f(\Phi) = 0 \\ \text{▪ } f(A) \leq f(B) \text{ if } A \subseteq B \end{array} \right.$ (the function is monotone non decreasing)
- Choquet integral (a rough presentation):
 - $\left[\begin{array}{l} \text{▪ } \Omega = \{ x_1, x_2, x_3 \} \\ \text{▪ } f(\Omega) = \alpha f(x_1) + \beta f(x_2) + \gamma f(x_3) + \delta f(x_1, x_2) + \dots + \sigma f(x_1, x_2, x_3) \end{array} \right.$ with $\alpha, \beta, \dots, \sigma$ weights
- OWA (Ordered Weighted Average):
 - order the elements following their value
 - define different weights with respect to the rank position
 - example 1 \rightarrow weight 1 for the higher
 - example 2 \rightarrow weight 0 for the extremes \rightarrow the gym. jury

link !

wikipedia ...

- Key-point: a plan is a set of coordinated actions

- So 
 - feasible actions
 - combinations of actions
 - synergies or cumulus of effects
 - alternatives (feasible)
 - effects (of each alternatives to the set of indicators)
 - ...

link !

Why Decision Aid (DA) in this context?

- Why Decision Aid (DA) in this context ?
- Design of what ?
 - i. PRODUCT → from (distributed) knowledge to concept
(generating-analyzing possible sol.)
 - ii. SERVICE → consider the different actors & their points
of view
 - iii. PROCESS → combination of (elementary) actions