

2°



 POLITECNICO DI MILANO



## 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

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# Mental models

## Examples (Theler, 1991)

- ① **Colorni** won  $\left\{ \begin{array}{l} 200 \text{ € (at a homely bingo)} \\ 800 \text{ € (at a parish bingo)} \end{array} \right.$

**Luè** won 1.000 € (at a Politecnico bingo)

who is more satisfied ?
- ② **Colorni** has to pay  $\left\{ \begin{array}{l} 200 \text{ € for ICI (a house owner tax)} \\ 800 \text{ € for IVA (VAT tax)} \end{array} \right.$

**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

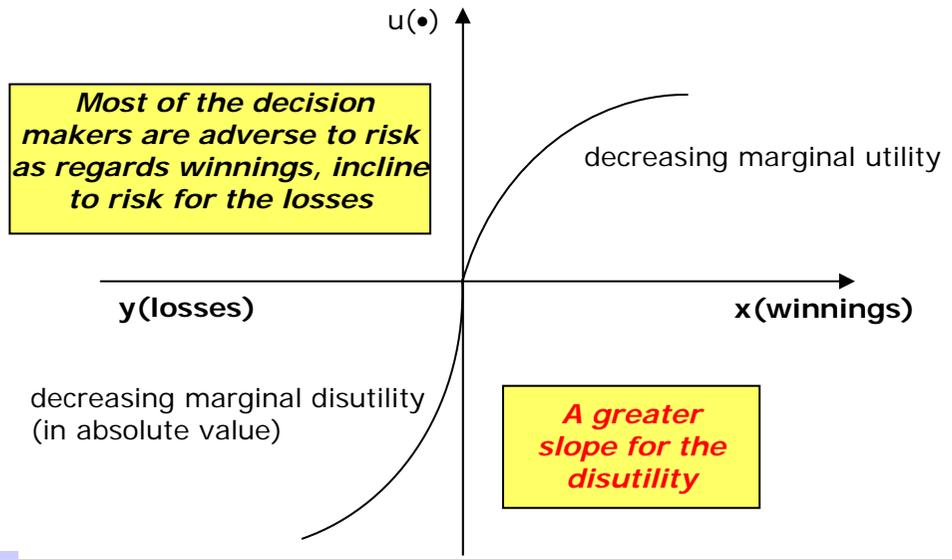


- ① There is a dissociation for the **winnings**
- ② There is an aggregation for the losses
- ③ There is a dissociation between **low winnings** and **high losses**
- ④ There is an aggregation between **high winnings** and **low losses**



**Dissociation = overestimation**  
**Aggregation = underestimation**

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



$u(x_1 + x_2) < u(x_1) + u(x_2) \rightarrow$  **UTILITY**

$u(y_1 + y_2) > u(y_1) + u(y_2) \rightarrow$  **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 ?**

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



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

**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 ?**

## 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

# Definitions – 1



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

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

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

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



by means of a lottery

▪ **Examples**

# 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, a movie of 1982)  O  S
8. Other examples proposed by you ...

# Axioms of probability theory

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

**A2** - Complementary probability (the event does not occur):  $1-p(\mathbf{e})$

**A3** – For events  $(e_1, e_2, \dots, e_k)$  that are mutually exclusive :  $p(\mathbf{e}_1 \text{ OR } \dots \text{ OR } \mathbf{e}_k) =$   
 $= p(\mathbf{e}_1) + \dots + p(\mathbf{e}_k)$

**A4** – For 2 independent events  $(e_1, e_2)$  :  $p(\mathbf{e}_1 \text{ AND } \mathbf{e}_2) = p(\mathbf{e}_1) * p(\mathbf{e}_2)$

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

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

$$p(\mathbf{e}_1/\mathbf{e}_2) = \frac{p(\mathbf{e}_1 \text{ AND } \mathbf{e}_2)}{p(\mathbf{e}_2)}$$

$$= \frac{p(\mathbf{e}_2/\mathbf{e}_1) * p(\mathbf{e}_1)}{p(\mathbf{e}_2)}$$

**A6** – If an event has an expected value  $\mathbf{v}_0$   
then a sequence of  $\mathbf{n}$  repetitions  
has an expected value of  $\mathbf{n} * \mathbf{v}_0$   
(see Lottery L1)

An example follows

# The barometer (an example)

w1 = good weather  
w2 = bad weather

W = state of nature

|        | w1  | w2  |
|--------|-----|-----|
| $p(w)$ | .80 | .20 |

|    |     |
|----|-----|
| 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

## Definitions – 2

### Lottery

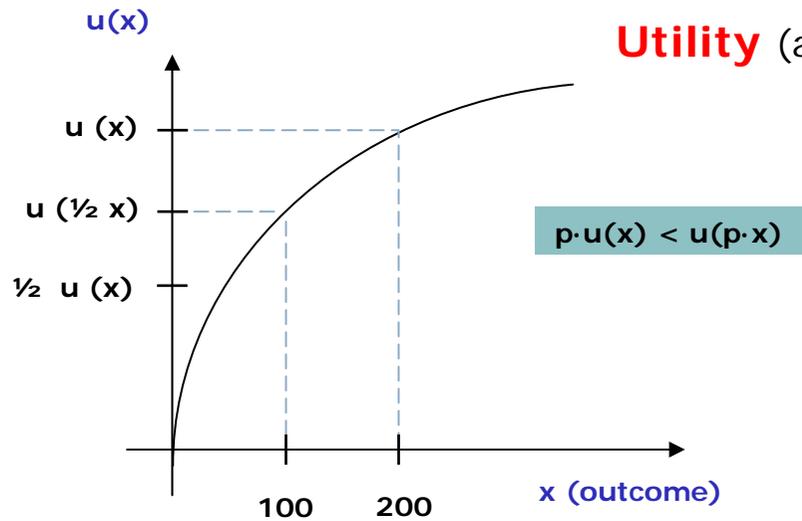
Given a ***certain event R1*** of which the decision-maker knows how to estimate the utility (that is, his level of satisfaction), if exists an ***uncertain event R2*** with a higher utility, the decision-maker is able to compare the utility of R1 (obtainable with certainty) with the ***equivalent utility*** 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").

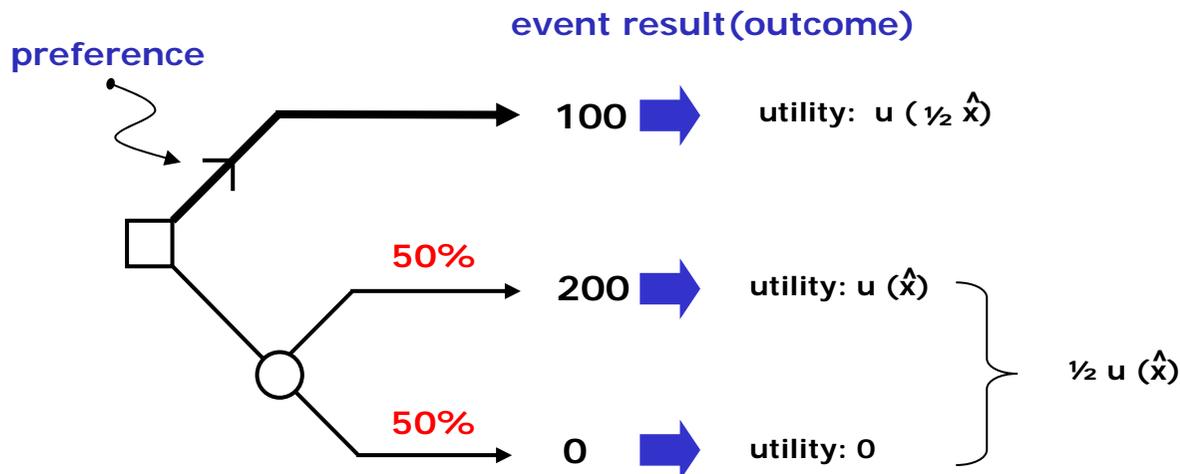
# Expected value vs. Expected utility



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



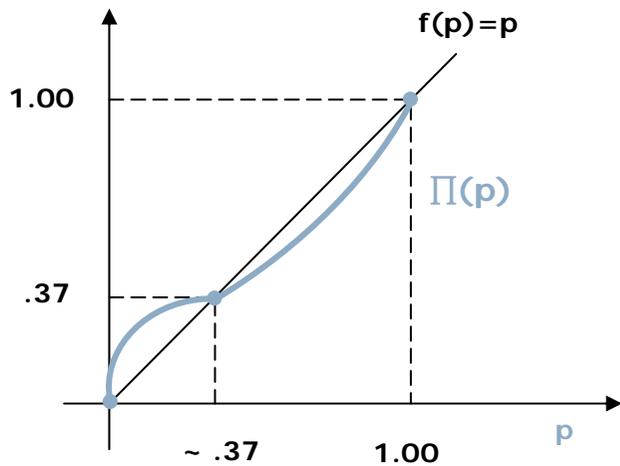
**CERTANTY EQUIVALENT  $\bar{e}$  :** value that makes the sure event  $\bar{e}$  equivalent to the lottery with  $x€$  at 50% and  $0€$  at 50%



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

# Mental models – 2

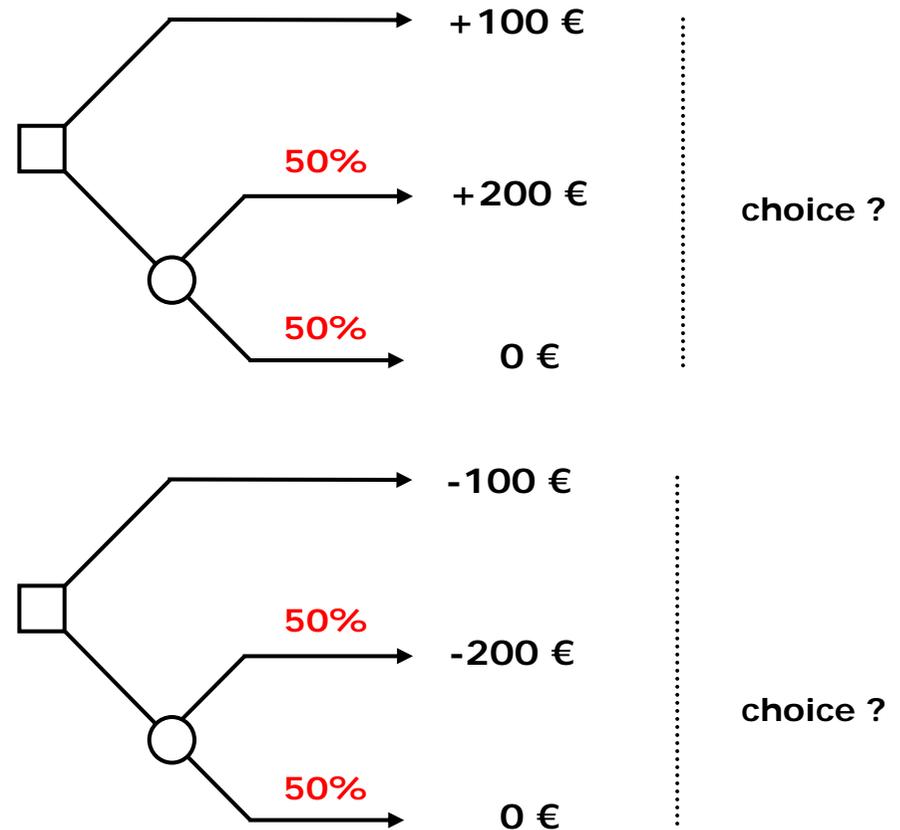
[Tversky & Kahneman]



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

|   |                   |   |                    |
|---|-------------------|---|--------------------|
| [ | <b>Protocol A</b> | 200 people will survive   | Better A or B<br>? |
|   | <b>Protocol B</b> | { with $p=1/3$ 600 will survive<br>with $p=2/3$ nobody will survive |                    |

|   |                   |   |                    |
|---|-------------------|---|--------------------|
| [ | <b>Protocol A</b> | 400 people will die   | Better A or B<br>? |
|   | <b>Protocol B</b> | { with $p=1/3$ nobody will die<br>with $p=2/3$ 600 will die |                    |

- 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)

- **Choiche** vs **Non-choice**

└─┬─> causes for not choosing

└─┬─> lack of information (however → **experiments**)

└─┬─> difficulty in appreciating the differences → **incomparability**



Outranking methods  
(Electre)

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

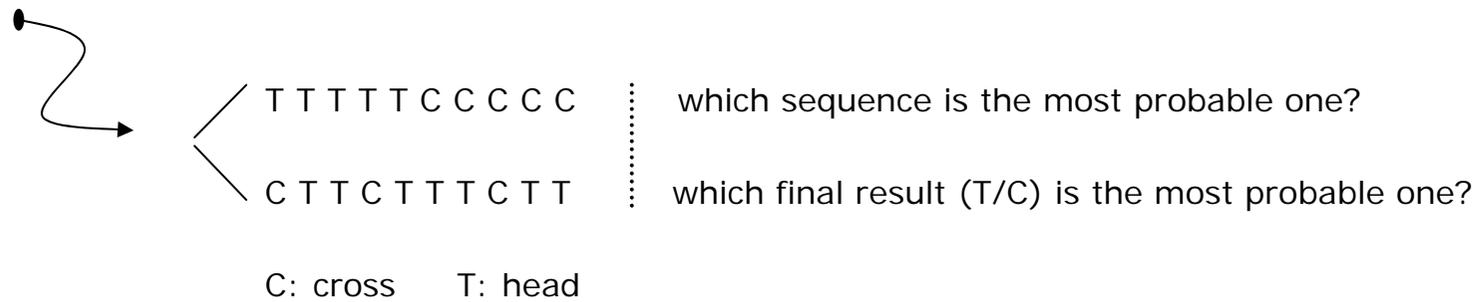
# Conclusions



- Bibliography:

1. *M. Piattelli Palmarini, "Psicologia ed economia delle scelte" (in Italian), Codice, 2005.*
2. *D. Kahneman, A. Tversky, "Choices, Values, and Frames", Cambridge Un. Press, 2000*

- Test



- Two problems

# Two problems

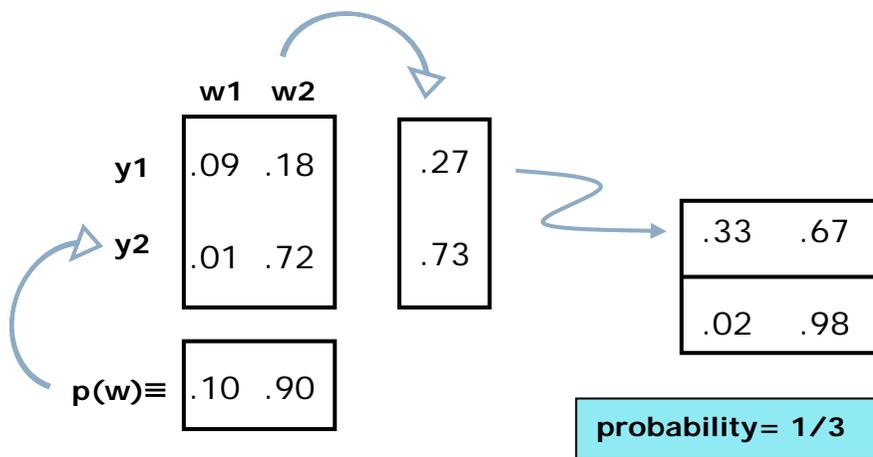
## 1. Example of Bayes

- ❑ a woman at a doctor → nodule
- ❑ examination → possible tumor (10%)
- ❑ mammography { reliable at 90%  
wrong answer at 20%
- ❑ "positive" result

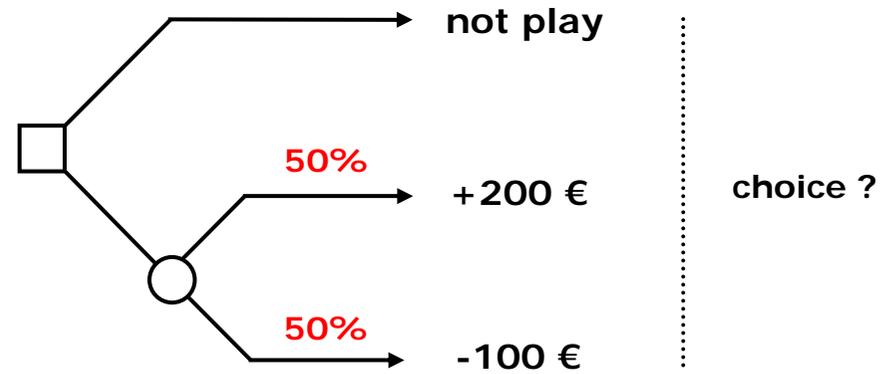
what is the probability to have a tumor ?



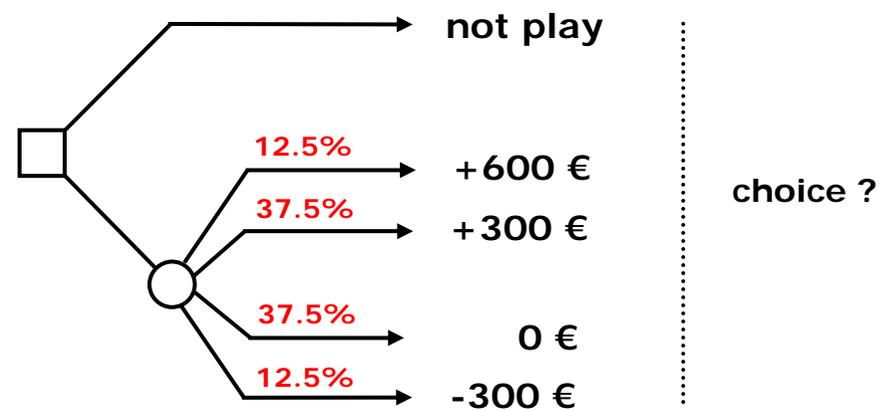
$y_1 = \text{positive result}$   
 $y_2 = \text{negative result}$ 
} {
 $w_1 = \text{tumor}$   
 $w_2 = \text{healthy}$



## 2. Example by Tversky (1992)



choice ?



choice ?



**D & D**  
**(Design & Decision)**

- Why Decision Aid (DA) in this context ?
  
- Design of what ?
  - i. PRODUCT**
  
  - ii. SERVICE**
  
  - iii. PROCESS**
  
  - iv. ... (other) ... ?

## Case 1 - Product

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



the objective

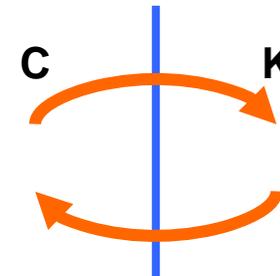
- A great number of alternatives!
  - ↳ hand protection
  - ↳ fore - hole
  - ↳ ...
- From a large amount of knowledge to a (limited) set of alternatives

Focus → generating possible solutions

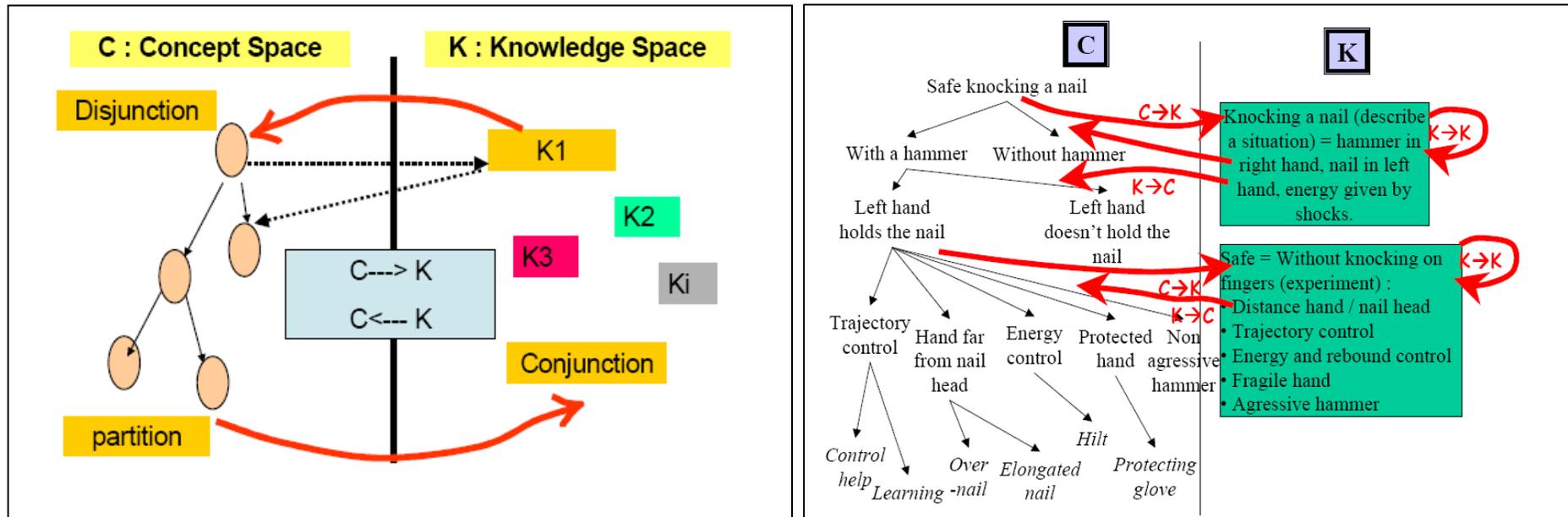
## Case 1 – Knowledge vs Concept

- 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

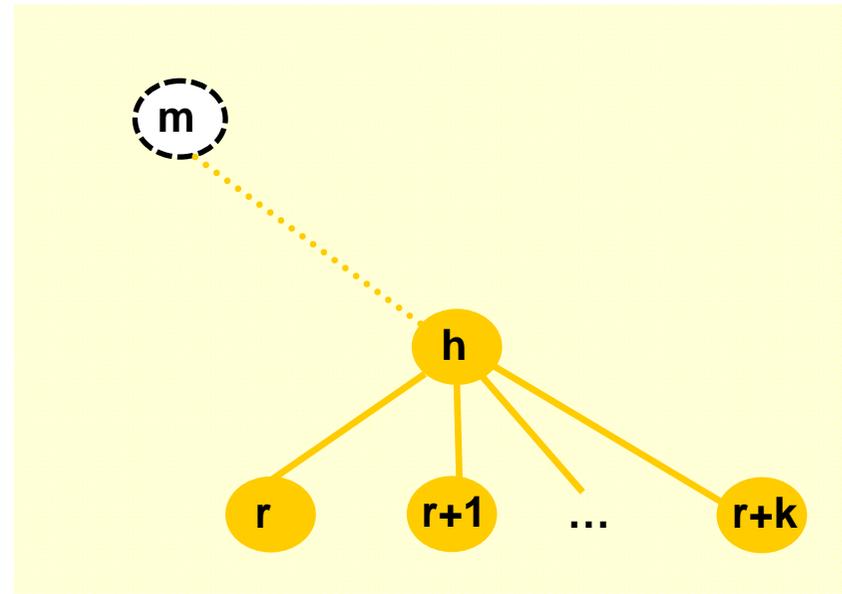
➤ Nail holder phase 1-a...

Link to ...

## 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

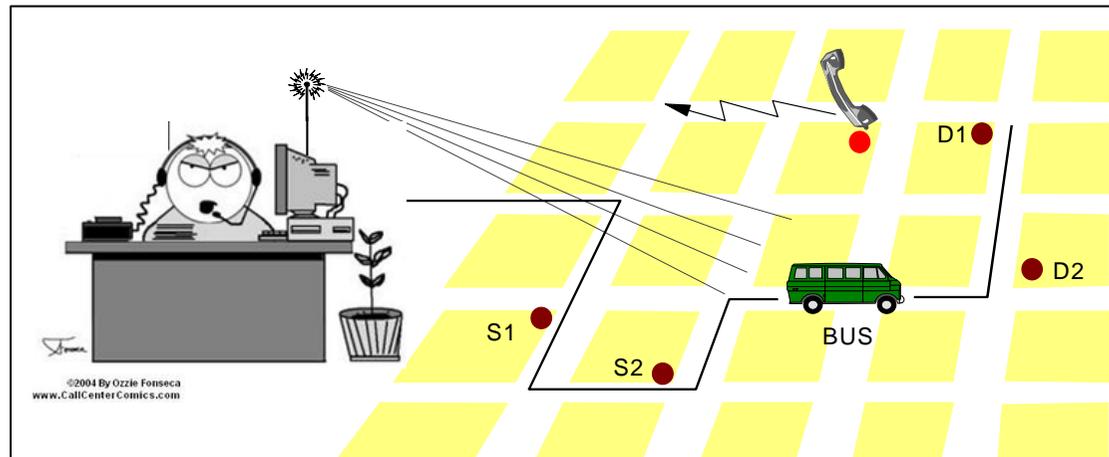
## Case 2 - Service



- 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](http://projectapps.vtt.fi/Connect/portal/alias_Rainbow/lang_en/tabID_3342/DesktopDefault.aspx)

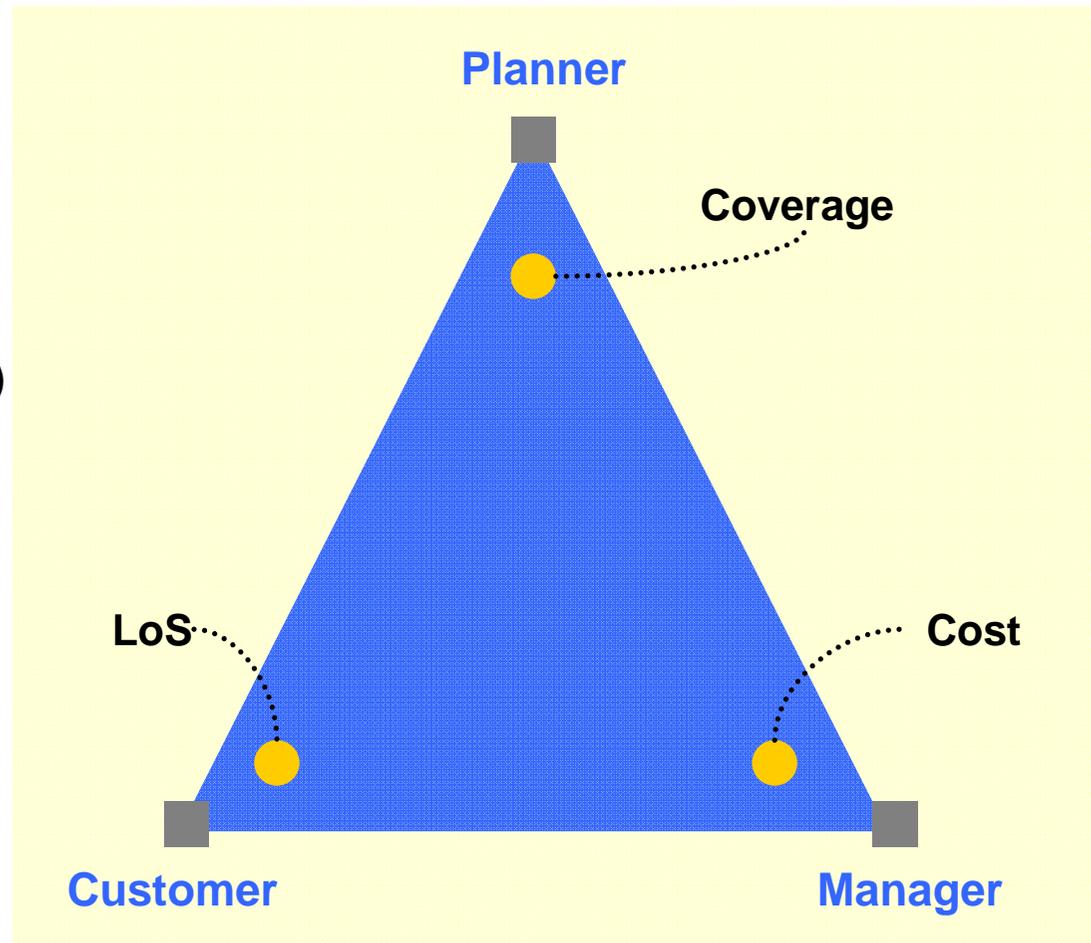
## Case 2 – A specific ITS (intelligent transport system)

- **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](http://www.tempi.piacenza.it/prontobus/prontobus.asp#come_nasce_prontobus)

## Case 2 – The trade-off approach

- Three points of view:
  - i. the planner objective is the area coverage
  - ii. the manager objective is the cost control
  - iii. 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)

## Case 3 - Process

- 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  $\longrightarrow$  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  $\longrightarrow$  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     |

$$\begin{aligned} \max f &= 50x_1 + 80x_2 + 20x_3 + 60x_4 \\ 10x_1 + 8x_2 + 5x_3 + 5x_4 &\leq W \\ x_i &= 0,1 \end{aligned}$$

$W$  (total weight supported) = 16

ADDITIVE  
MODEL

- Decision aid: an algorithm
    - exact :  $2^4$  combinations (see \*)
    - heuristic (ranking by ...)
- then...
- $$\left. \begin{array}{l} \text{item}_4 \rightarrow 60/5 = 12 \\ \text{item}_2 \rightarrow 80/8 = 10 \\ \text{item}_1 \rightarrow 50/10 = 5 \\ \text{item}_3 \rightarrow 20/5 = 4 \end{array} \right\}$$

## Case 3 – Combinatorics

values: 50, 80, 20, 60

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

| # | X <sub>1</sub> | X <sub>2</sub> | X <sub>3</sub> | X <sub>4</sub> | 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 <sub>1</sub> | X <sub>2</sub> | X <sub>3</sub> | X <sub>4</sub> | 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  $\Omega$  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

## Case 3 – A regional plan

- 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 ?
- 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