

## Expected Utility of a Lottery:

$$U(p_1, S_1; \dots; p_n, S_n) = \sum_i p_i U(S_i)$$

Utility  $f^n$  exists for an agent, but they are not specific. An agent's behavior won't change if utility gets transferred.

$$U'(s) = aU(s) + b, \quad a > 0, \quad a, b \text{ constant.}$$

In a game playing  $\rightarrow$  agent needs preference ranking on states not a number  $\rightarrow$  value  $f^n$  or ordinal utility  $f^n$

## Utility function:

- ✓ Function to map lotteries to real number.
- ✓ Agents should follow the axioms.
- ✓ An agent can have any preference it likes.

## Utility assessment & utility scale:

Preference Elicitation: Decision theoretic system needs to work on agent's utility  $f^n$  to take decision of the agent.

Normalized utilities: Scale of preference-

best possible reward at  $U(s) = U_T$

worst " " " "  $U(s) = U_L$

Scale it with  $U_T = 1$  &  $U_L = 0$ .

Standard lottery: Given the utility scale, the utility of a particular prize  $S$  can be assessed

by asking the agent to choose bet<sup>n</sup>  $\leq 2$  lottery  $[p, u_T; (1-p), u_L]$ .  $p$  is adjusted until the agent becomes indifferent bet<sup>n</sup>  $\leq$  the lottery:

Micromort  $\rightarrow$  Value for life  $\rightarrow$  million boarded revolver  
one in a million chance of death  $\rightarrow$  Car purchase.  
(230 miles = 1 micromort)  
\$50/10 micromort pay).

You can't kill yourself for \$50 million

Qualy  $\rightarrow$  quality adjusted life.

The utility of money

Monotonic Preference  $\rightarrow$  More money over less money.

Expected Monetary Value (EMV)

Choose bet<sup>n</sup> \$10000 & a lottery with 0 or \$25000  $\rightarrow$  Most people choose 1<sup>st</sup> one.

The EMV of the lottery =  $\frac{1}{2}(0) + \frac{1}{2}(25000)$   
 $= 12500 > 10000$ , but

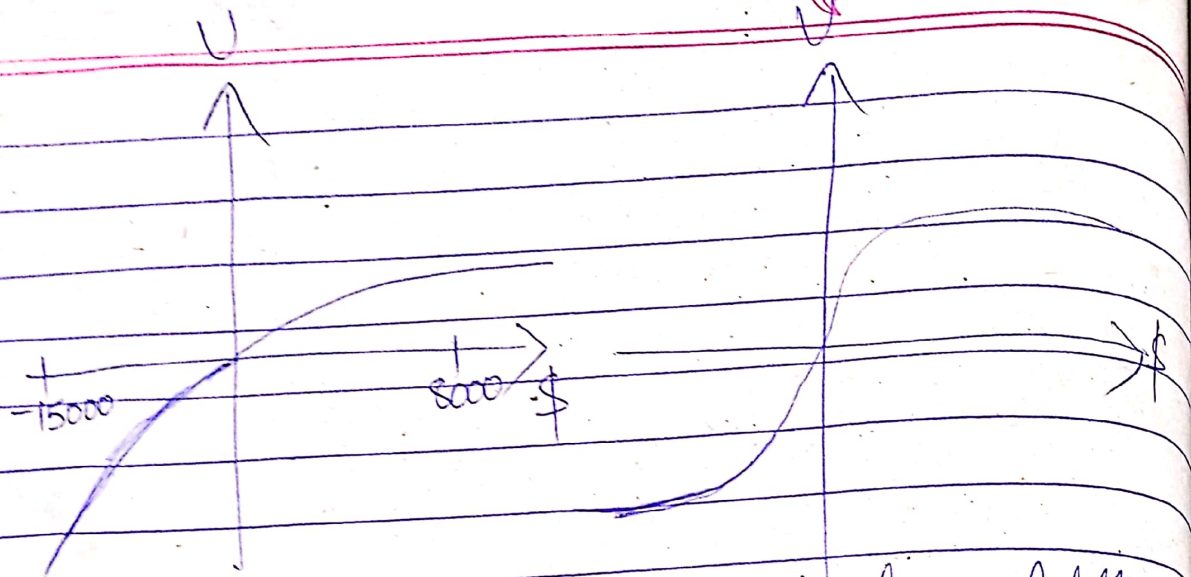
that does never mean 1<sup>st</sup> one is wrong.

$$EU(\text{Accept}) = \frac{1}{2} U(S_k) + \frac{1}{2} U(S_k + 25000)$$

$$EU(\text{Decline}) = U(S_k + 10000)$$

Assign utility 5 to  $S_k$ , 9 to  $S_k + 25000$  & 8 to  $S_k + 10000$   
then  $EU(\text{Decline}) > EU(\text{Accept})$ .





Data over limited range  
(People afraid to debt)  
Risk averse

A typical curve for full range  
(Enough debt  $\rightarrow$  less fear  
to have more debt.)  
Risk Seeking

$$U(L) < U(EMV(L))$$

Value of lottery  $\rightarrow$  Certainty equivalent  $\rightarrow$  the value agent will accept in lieu of a lottery.

E.g.: \$400 instead of a lottery of 0 & \$1000 with equally probable.  $\rightarrow$  EMV of the lottery = \$500

EMV of a lottery - Certainty equivalent  
= Insurance premium  $\rightarrow$  Insurance Companies work on it.

Small amount can be invested for gambling causing almost no change in the linear curve of your wealth  $\rightarrow$  risk-neutral.

Expected utility & Post-decision disappointments:

To choose optimal action:

$$a^* = \arg \max_a EU(a|e)$$



It will outcome the best possible action iff:

- ✓ EU is calculated correctly w.r.t. probability model
- ✓ Probability model correctly reflects underlying stochastic process,
- ✓ We will get the expected utility if whole process is repeated many times.

In reality  $\rightarrow$  oversimplification  $\rightarrow$  i) we don't know enough / ii) Computation of true utility is too difficult.

$\therefore$  Estimate  $\hat{EU}(a|e)$  of the true utility.

If estimate is unbiased:  $E(\hat{EU}(a|e) - EU(a|e)) = 0$ .

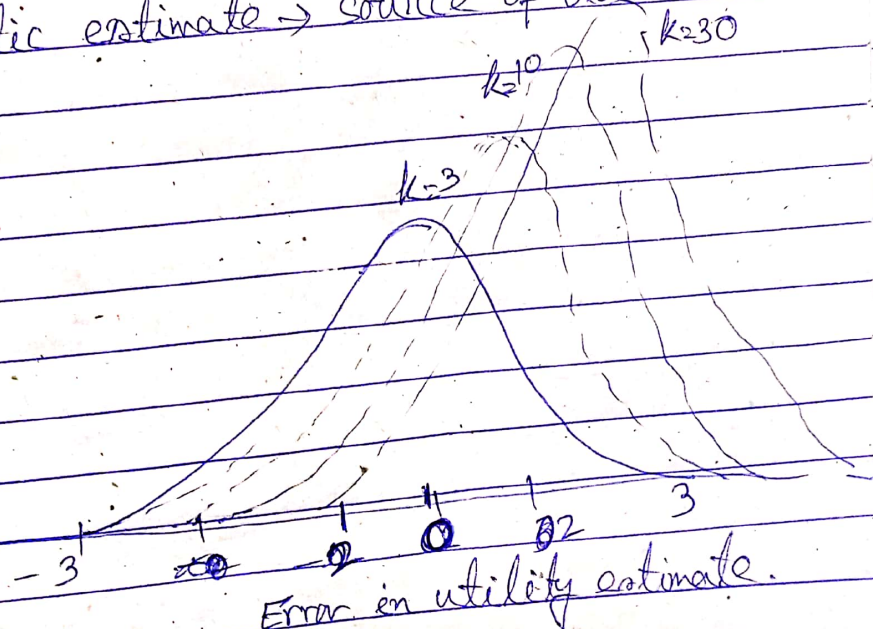
But it's not the case in reality.

Ex: Decision problem with  $k$  choices. Error in each utility estimate  $\rightarrow$  0 mean & s.d  $\rightarrow 1$ .

During generation of estimates  $\rightarrow$  +ve error  
 $\rightarrow$  -ve error

Selecting action with the highest utility estimate  $\rightarrow$  overly optimistic estimate  $\rightarrow$  source of bias.

$k=3$ , mean = 0.85  
 $\therefore$  disappointment  
= 85% of s.d.  
for  $k=30$ ,  
disappointment  
= 2 x s.d.





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Optimizer's curse  $\rightarrow$  drug that cured 9 out of 10 patients may probably be worse than the drug that cured 80 out of 100 patients.

Human judgement & Irrationality:

Normative theory: Describes how rationally the agents should act.

Descriptive theory: How human actually acts.

A: 80% chance of \$4000

C: 20% chance of \$4000

B: 100% " " \$3000

D: 25% " " \$3000

A over B for sure,

C over D higher EMV.

Now,  $C \succ D \Rightarrow U(4000\$) > U(3000\$)$  ✓

but,  $A \succ B$  reflects the inverse.

Certainty effect: People are strongly attracted to the gains with certainty.

People with distrust will go with certainty to minimize the regret.

1/3 red balls, 2/3 either black or yellow.

A: \$100 for a red ball

C: \$100 for a red & yellow ball

B: \$100 for a black ball

D: \$100 " " black & yellow ball

$A \succ B, D \succ C$

↓  
People prefer known probability than unknown

$\rightarrow$  Ambiguity aversion

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Framing Effect: Same information  $\rightarrow$  framed according to preferences  $\rightarrow$  prefers treatments with 90% survival rate than 10% death rate.

Anchoring Effect: Sale  $\rightarrow$  high estimate generation.

Human irrationality  $\rightarrow$  field of evolutionary psychology  $\rightarrow$  brain doesn't take decisions on probabilities & prizes with decimal numbers.