# Week 1 Summary: Introduction. Decision Trees.

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## 1 Effective Decision Rules

#### 1.1 Maximin and Maximax

They're the same, just at different extreme ends.

## 1.1.1 Maximin

Informal Principle of choosing the act with the largest minimal outcome obtainable

Formal  $a_i \succeq a_j \iff \min(a_i) \ge \min(a_j)$ 

#### 1.1.2 Maximax

Informal: Principle of choosing the act with the largest maximal outcome obtainable

Formal:  $a_i \succeq a_j \iff \max(a_i) \ge \max(a_j)$ 

#### 1.2 Further Constraints: Leximin and Leximin Modifications

Below is for leximin. Leximax is just the opposite

## 1.2.1 Explanation

Description: Essentially a way to filter the dominance space from maximin (also an effective decision rule)

**Procedure:** Iteratively compare the next minimal outcomes under the states until you find a difference. Remove the act(s) with a lower outcome

Equivalence: The only remaining equivalent acts are acts which are equivalent in every state

## 1.2.2 Formal Definition

 $a_i \succ a_j \iff$  there exists some positive integer n such that  $\min^n(a_i) > \min^n(a_j)$  and  $\min^m(a_i) = \min^m(a_j)$  for all m < n

## 1.3 Combination: Optimism-Pessimism Rule (a.k.a alpha-index rule)

**Informal:** Weighted combination of maximin and maximax. Weight parameter  $\alpha$  reflects optimism

**Formal:**  $a_i \succeq a_j \iff \alpha \cdot \max(a_i) + (1 - \alpha) \cdot \min(a_i) \ge \alpha \cdot \max(a_j) + (1 - \alpha) \cdot \min(a_j)$ 

## 1.3.1 Random Thought

You can probably combine with leximin/leximax to some degree too, to get an even better framework

## 1.4 Problem: Relevance of non-extreme values [all]

Particularly easy to see when the mins are close. E.g. below.

Applying the maximin principle selects option  $a_2$ , but intuitively  $a_1$  seems far better.

Note: Example formulated for maximin/leximin. Just flip the logic for maximax

	$s_1$	$s_2$	$s_3$	$s_4$	$s_5$	$s_6$	$s_7$
$\overline{a_1}$	1	0.99	99999	99999	99999	99999	99999
$a_2$	1	1	1	1	1	1	1

Pedantic Note: you don't know the probability distribution of the state space. Maybe  $a_2$  is better after all. . .

## 1.5 Problem: Unintuitive equivalence [Minimax, Maximax]

Note: Example formulated for maximin. Just flip the logic for maximax

	$s_1$	$s_2$
$a_1$	1	99999
$a_2$	1	1

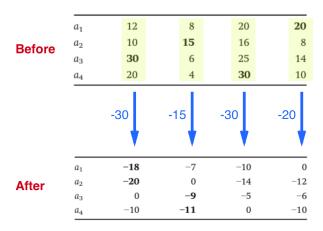
Under vanilla maximin, both acts are equally reasonable. Obviously, this is weird

## 1.6 Minimax Regret

## 1.6.1 Explanation

• Essentially an attempt to formalize the concept of regret

## 1.6.2 Procedure (won't formally describe)



#### 1.6.3 Note

It's not globally accepted that this concept is relevant to rational decision making. But a substantial number of theorists think it is.

## 1.6.4 Problem: Argument from irrelevant alternatives

- Ranking can be altered by adding a non-optimal alternative
- Breaks intuition about how a "normatively plausible decision rule must not be sensitive to the addition of irrelevant alternatives"

### 1.6.4.1 Example: Addition of $a_5$

Table 3	3.14			
$\overline{a_1}$	12	8	20	20
$a_2$	10	15	16	8
$a_3$	30	6	25	14
$a_4$	20	4	30	10
$a_5$	-10	10	10	39
Table 3	3.15			
$\overline{a_1}$	-18	-7	-10	-19
$a_2$	-20	0	-14	-31
$a_2$	0	-9	-5	-25

-11

-5

-10

0

-20

-29

#### 1.6.4.2 Counter

• Prima facie intuition is wrong. It's "rational to compare alternatives with the entire set of alternatives".

## 2 Transformative Decision Rules

### 2.1 Principle of Insufficient Reason

**Pro**: Decision under ignorance  $\rightarrow$  Decision under risk

## 2.1.1 Problem: Which states should be considered? Modeling problem

- More states means lower probability for each state (direct influence on choice strategy)
- Choosing relevant states is often not easy
- Traditional argument for ir is from symmetric states (e.g. dice sides). Many problems have no such symmetry

### 2.1.2 Problem: Uniform probability assumption seems arbitrary

Under ignorance, any probability distribution seems to be equally justifiable as any other. Assumption of equality seems arbitrary

#### 2.1.2.1 Counter: Symmetry

- Assume every probability distribution is equally justifiable
- Use lens of toy 2-state case  $S = \{s_1, s_2\}$
- Every probability distribution has a symmetric partner (e.g.  $\{p_{s_1}=0.6,p_{s_2}=0.4\}$  has  $\{p_{s_1}=0.4,p_{s_2}=0.6\}$

- Exception: Uniform distribution. Suggests uniform distribution is a collapsed state of (in this case) 2 identical probability distributions. Making it multiplicatively more reasonable as any other case (in this case, 2x more reasonable)

#### 2.1.2.1.1 Problem

• Beautiful argument, but the assumption of the uniform distribution being an additively collapsed one is a bit dubious imo

## 2.1.3 Problem: Practically, it's often not complete ignorance

You generally know some things or at least have a sense of ordinal ranking for the probabilities of some of the states. Why not use it?

### 2.2 Randomized Acts

### 2.2.1 Procedure

- Create a new act with expected values as outcomes
- If your decision making strategy selects random act, then randomly choose one of those initial acts
- Note: Choosing the random act is not a choice on its own, but a procedure to arrive at an actual choice

## **2.2.1.1** Example Introduce random act $a_3$

Table 3.18		
$a_1$	1	0
$a_2$	0	1

Table 3.1	9	
$\overline{a_1}$	1	0
$a_2$	0	1
$a_3$	1/2	1/2

### 2.2.2 Potential Problem

I'm assuming the random choice doesn't have to be uniformly distributed. But this opens up a whole can of worms by allowing you to tweak the probability distribution of the random function to bias it towards whatever choice you irrationally want.

## 3 Axiomatic Analysis of the Decision Rules

Taken directly and shamelessly from the textbook

## 3.0.1 Descriptions of Axioms

- 1. **Ordering**:  $\succeq$  is transitive and complete. (See Chapter 5.)
- Symmetry: The ordering imposed by 

  is independent of the labelling of acts and states, so any two rows or columns in the decision matrix could be swapped.
- 3. **Strict Dominance**: If the outcome of one act is strictly better than the outcome of another under every state, then the former act is ranked above the latter.
- 4. **Continuity**: If one act weakly dominates another in a sequence of decision problems under ignorance, then this holds true also in the limit decision problem under ignorance.
- Interval scale: The ordering imposed by 

  remains unaffected by a positive linear transformation of the values assigned to outcomes.
- Irrelevant alternatives: The ordering between old alternatives does not change if new alternatives are added to the decision problem.
- 7. **Column linearity**: The ordering imposed by  $\succeq$  does not change if a constant is added to a column.
- 8. **Column duplication**: The ordering imposed by <u>></u> does not change if an identical state (column) is added.
- 9. **Randomisation**: If two acts are equally valuable, then every randomisation between the two acts is also equally valuable.
- 10. **Special row adjunction**: Adding a weakly dominated act does not change the ordering of old acts.

### 3.0.2 Axiomatic Analysis

	Maximin	Optimism– pessimism	Minimax regret	Insufficient reason
	WIGAIIIIII	pessiiiisiii	regret	reason
1. Ordering	$\otimes$	$\otimes$	$\otimes$	$\otimes$
2. Symmetry	$\otimes$	$\otimes$	$\otimes$	$\otimes$
3. Strict dominance	$\otimes$	$\otimes$	$\otimes$	$\otimes$
4. Continuity	$\otimes$	$\otimes$	$\otimes$	$\otimes$
5. Interval scale	×	$\otimes$	×	×
6. Irrelevant alternatives	$\otimes$	$\otimes$	_	$\otimes$
7. Column linearity	_	-	$\otimes$	$\otimes$
8. Column duplication	$\otimes$	$\otimes$	$\otimes$	_
9. Randomisation	$\otimes$	_	$\otimes$	×
10. Special row adjunction	×	×	$\otimes$	×

Symbol	Meaning
-	Incompatible with decision rule
×	Compatible with decision rule
$\otimes$	Necessary and sufficient for decision rule