

# **Value-Driven Portfolios**

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# Start with “**portfolio**”

Let's start with a few basic questions:

- ❑ **What is a portfolio?**

- A collection of things (assets)

- ❑ **Why do we care about them?**

- $v(A \cup B) \neq v(A) + v(B)$

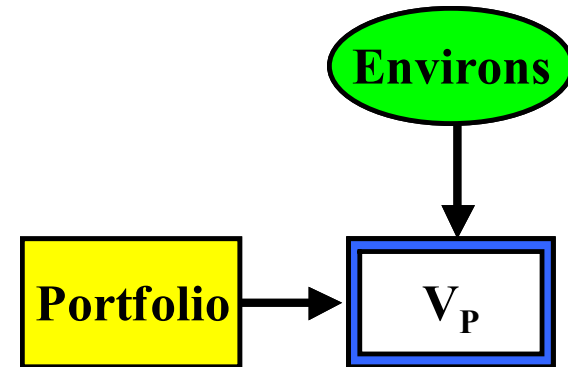
- ❑ **How do you know if one's any good?**

- *hmmm...? Maybe this should be linked to the notion of **value**?*

# Consider the underlying models

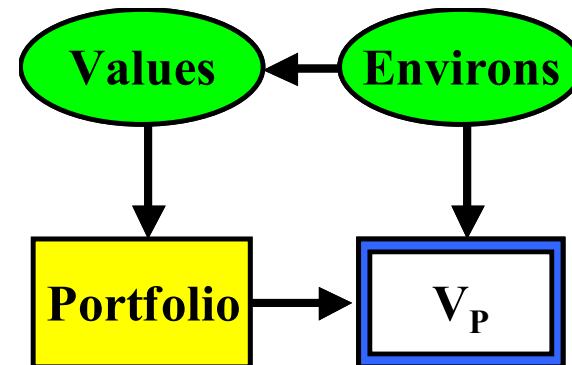
## Typical model:

- ❑ Independent portfolio decisions
- ❑ Unbounded search (optimize)
- ❑  $V_P = f(P, E)$



## Value-driven model:

- ❑ Dependent portfolio decisions
- ❑ Bounded search (maximize)
- ❑  $V_P = f(P, V, E)$



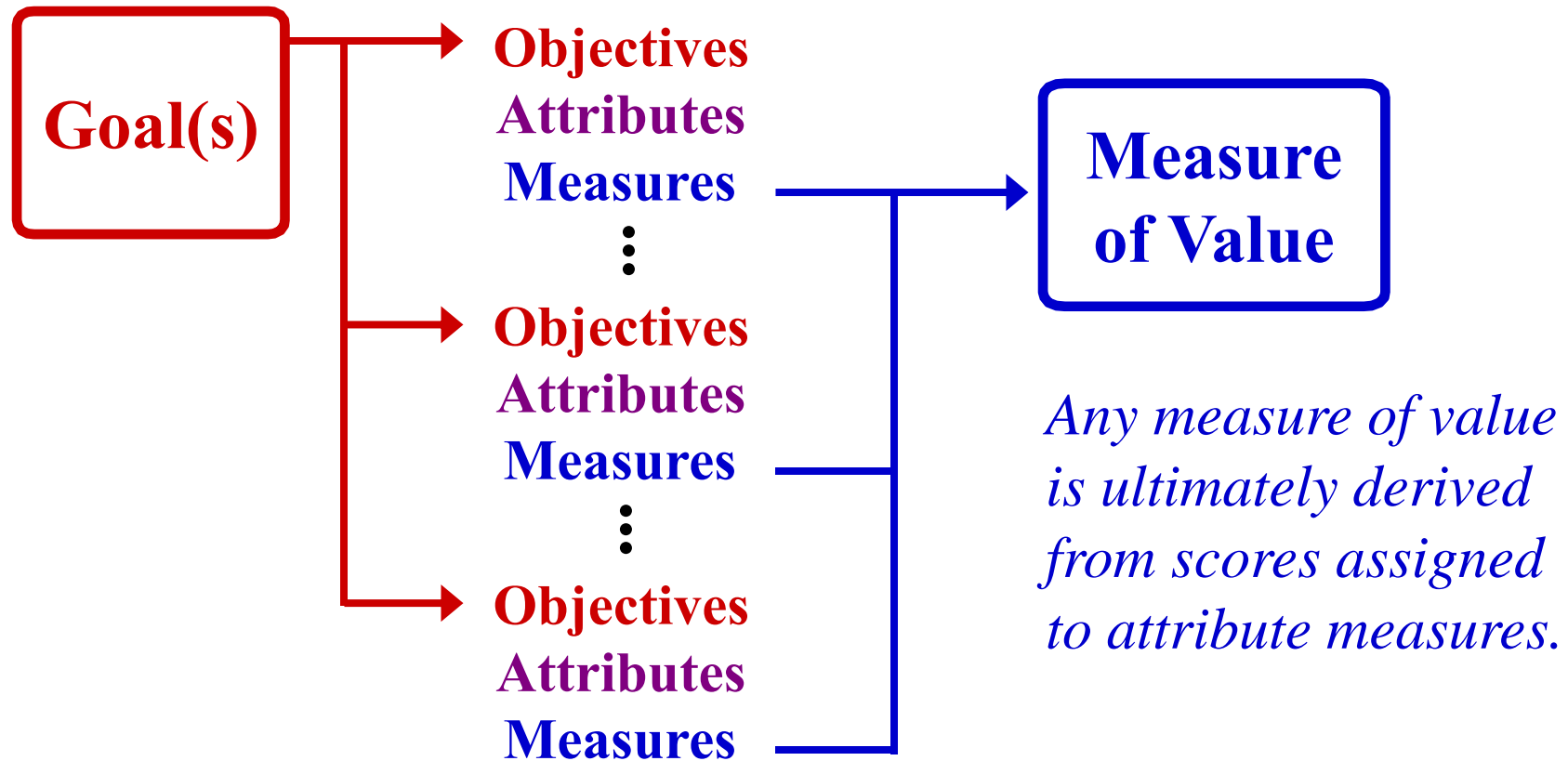
# How do we measure “value”

We need to answer three fundamental questions:

- ☐ What's important?
- ☐ How important is it?
- ☐ How much is enough?

**What is important?**

# Defining “value”



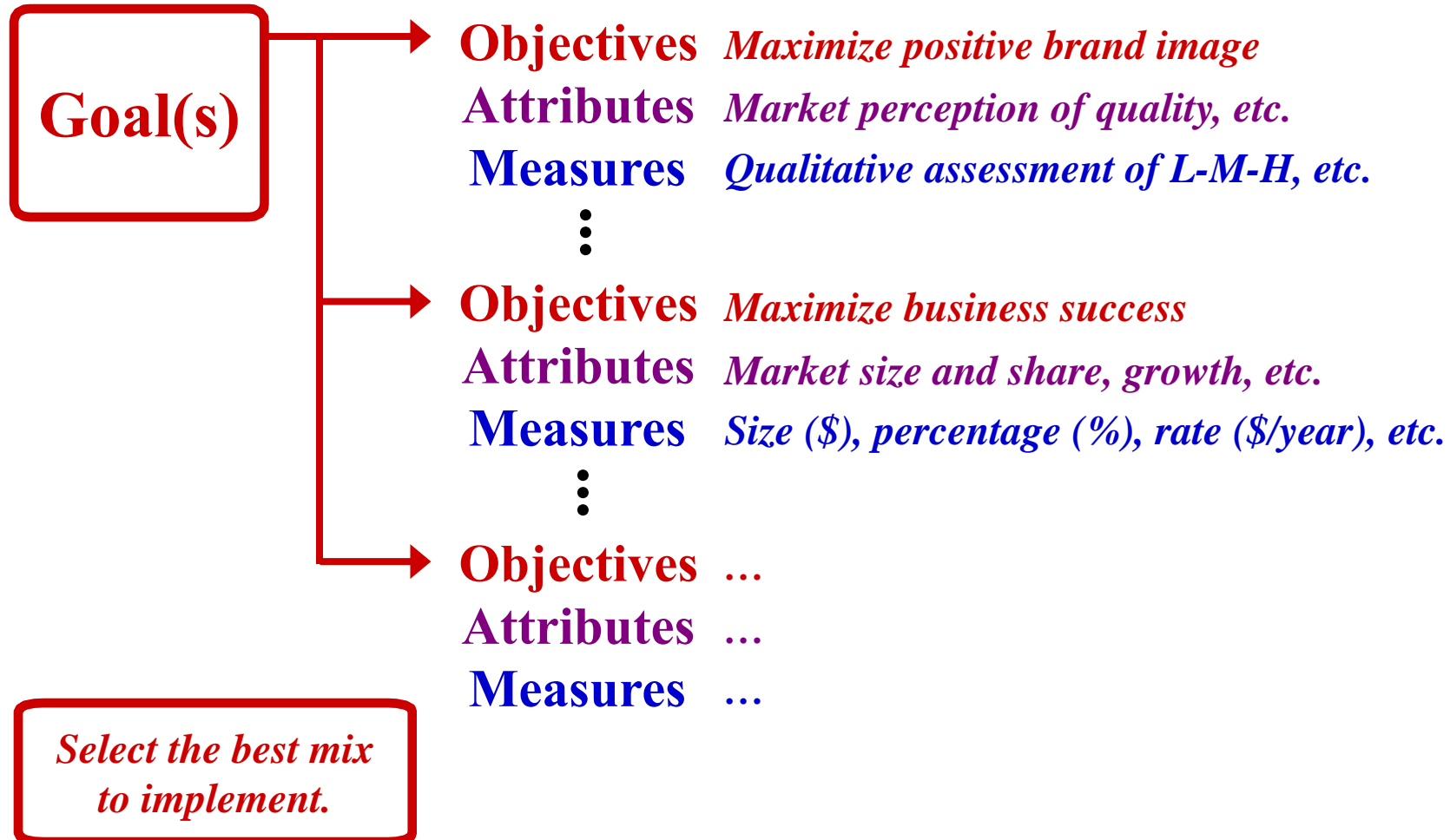
# Defining “value”

Value is to large extent determined by goals, context and operational environment.

## **Situation:**

I have to choose from a set of potential products those few that maximize the overall value of my business.

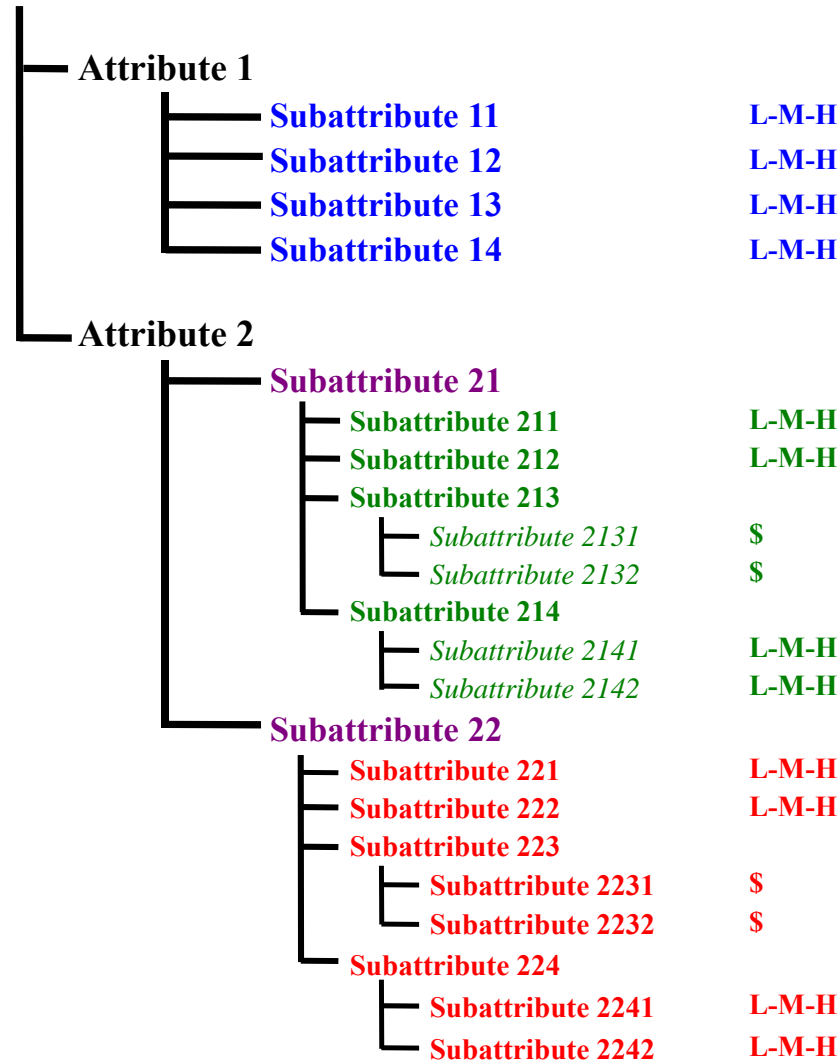
# Defining “value”





# A value-based hierarchy

Value of mix X



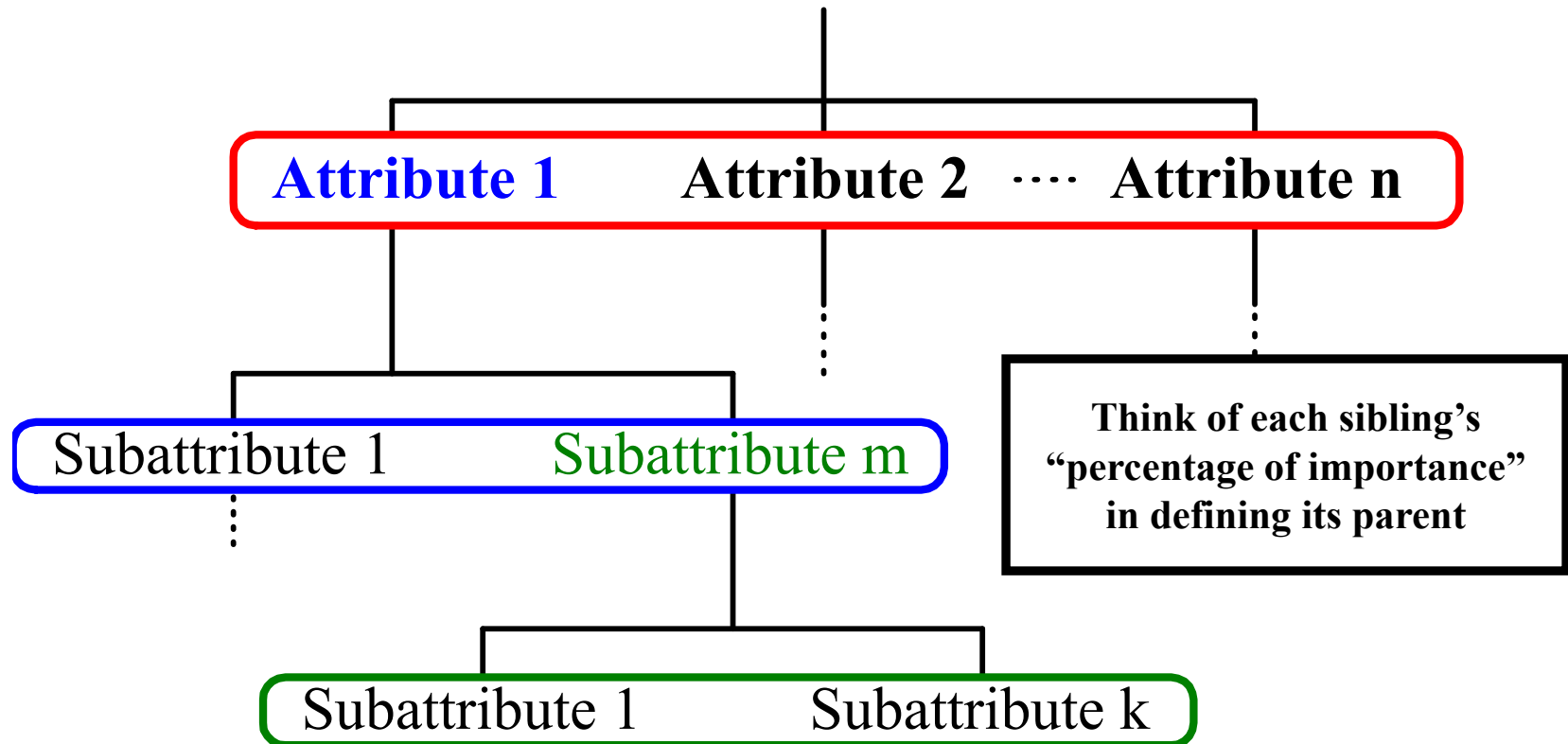
**So, what's the value of mix X?**

*That depends on the subattribute scores and how important each is to the overall mix...*

**How important is it?**

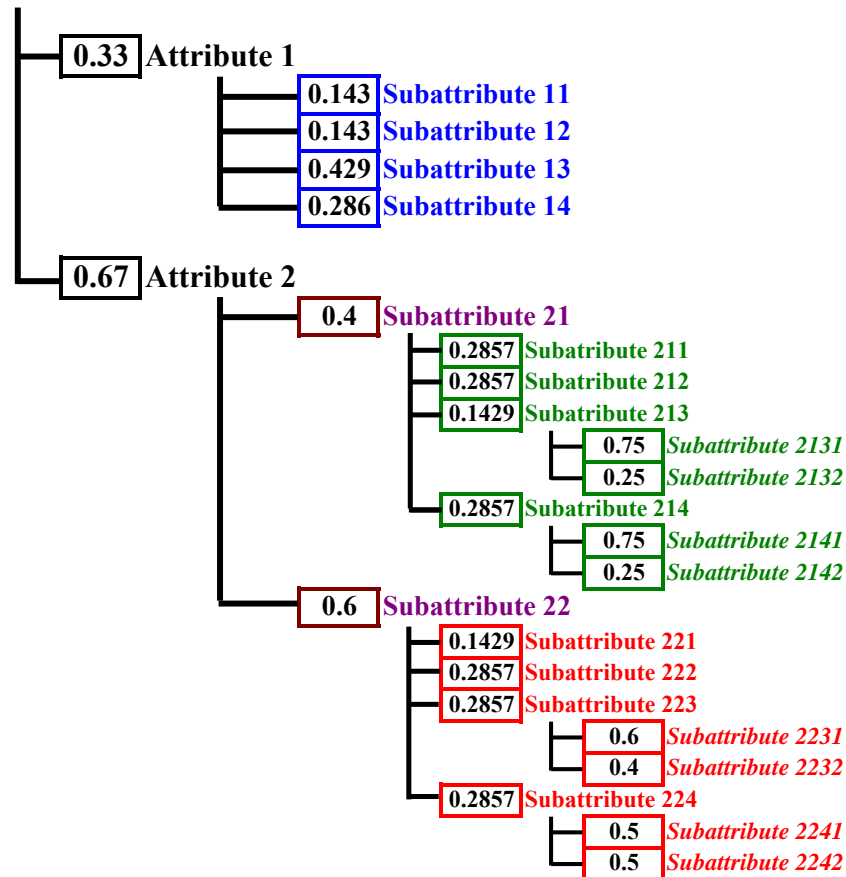
# The “importance” of attributes

## Alternative A



# A weighted hierarchy

Value of mix X



Weights can be determined  
a number of different ways:

- ❑ Direct assessment
- ❑ Pairwise comparisons
- ❑ Rank-reciprocal
- ❑ Swing weights

**How much is enough?**

# We need a “value function”

We need a notion of value function to deal with:

1. the problem of different attribute measures

*(How do we compare H/M/L with dollars?)*

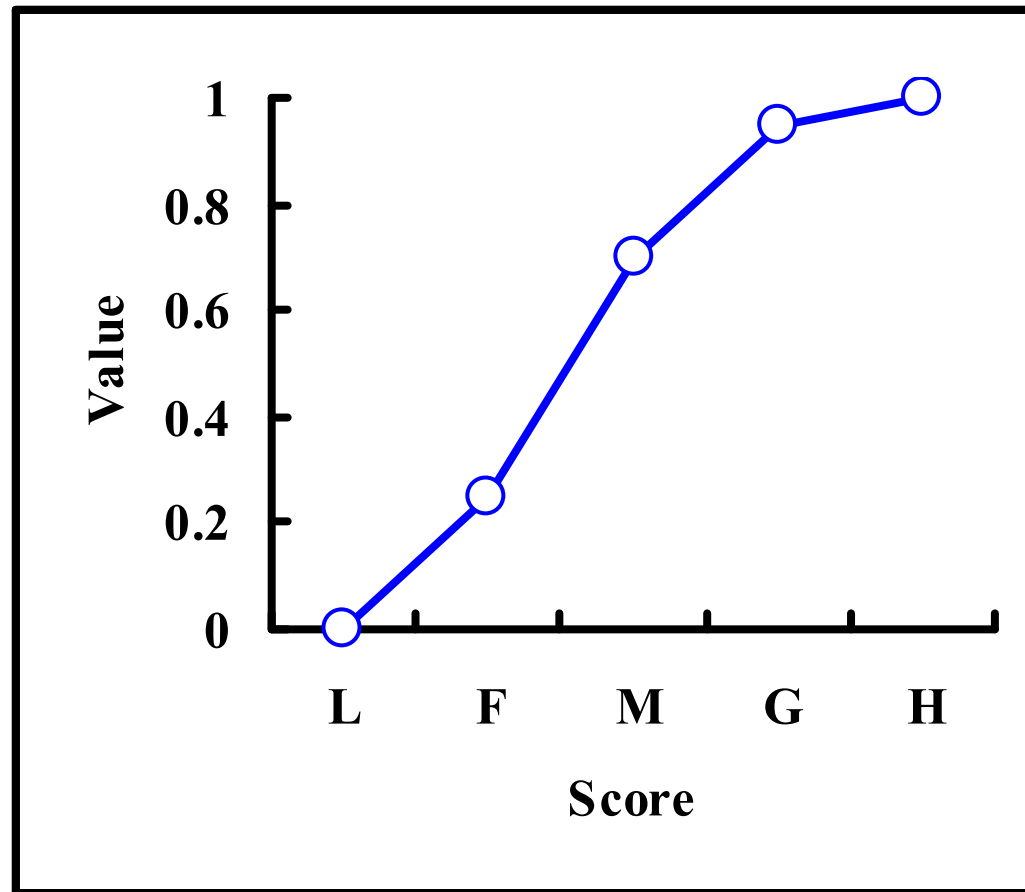
2. the decision maker's preferences for marginal changes in attribute scores.

*(Is an increase from L to M worth the same as an increase from M to H?)*

# Value scales over attribute scores

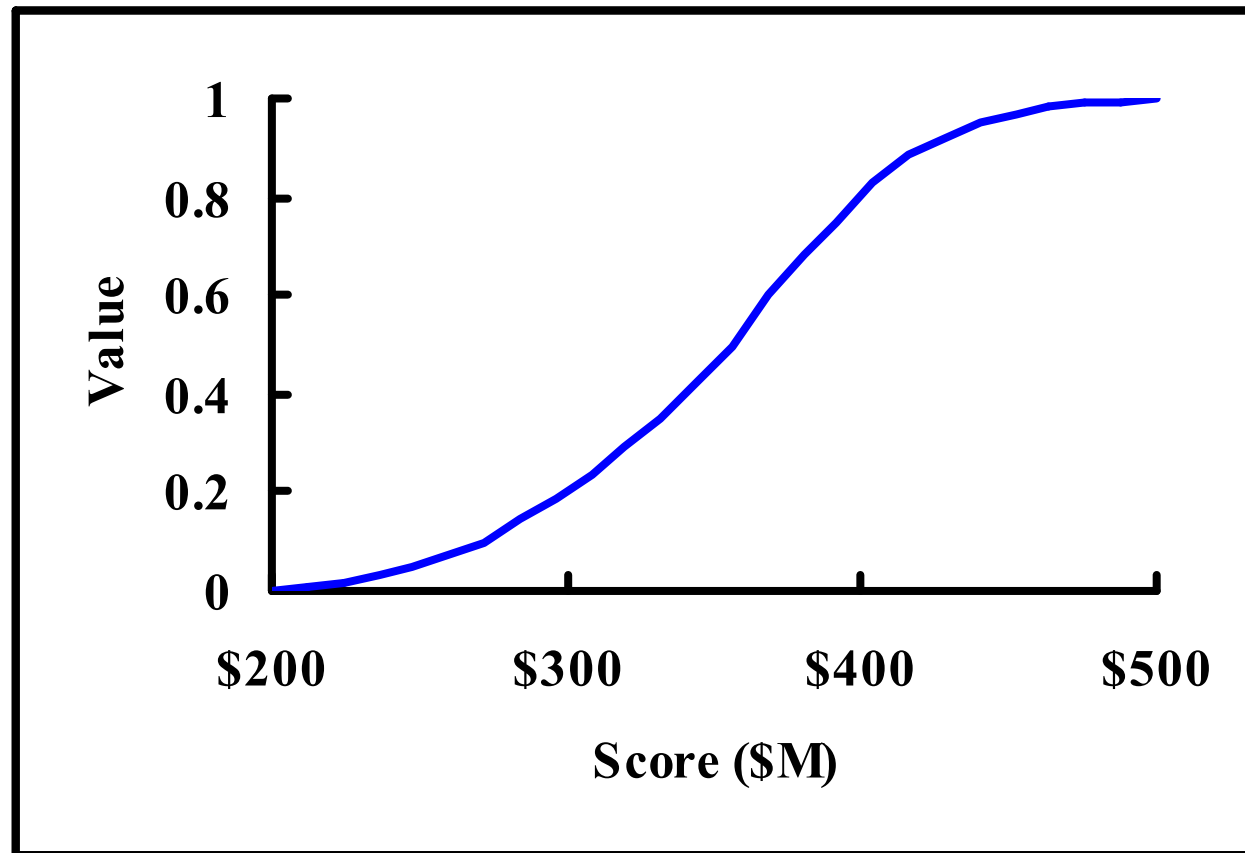
Perception of quality (“more is better”)

|   |      |
|---|------|
| L | 0    |
| F | 0.25 |
| M | 0.7  |
| G | 0.95 |
| H | 1    |



# Value scales over attribute scores

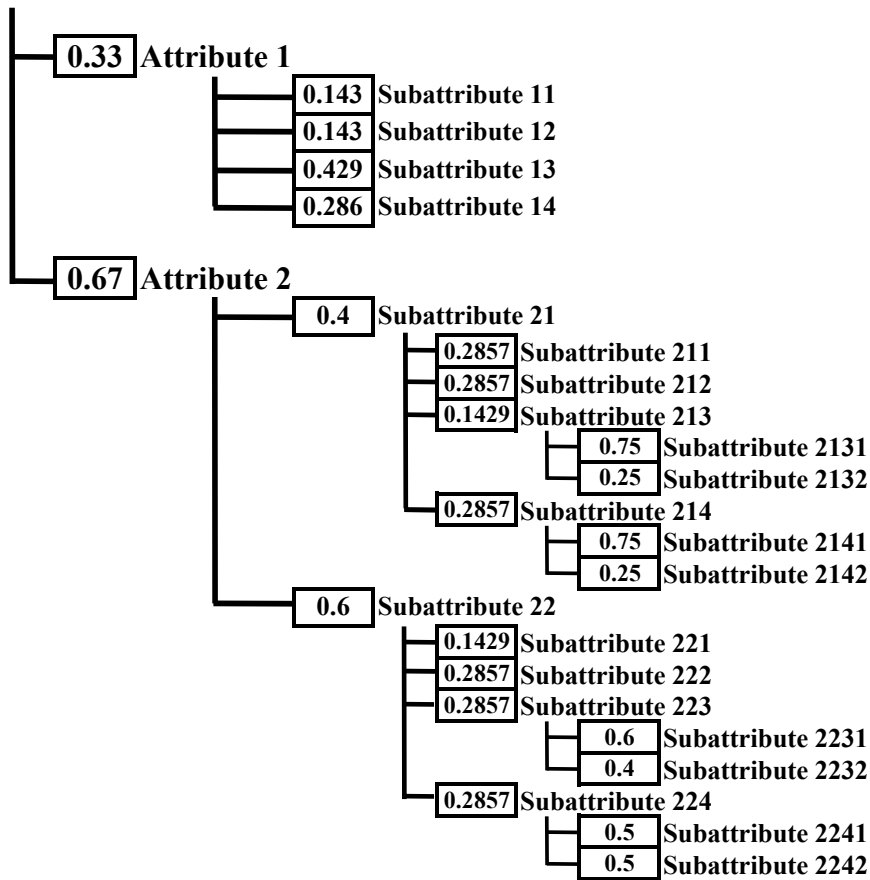
Existing market size (“more is better”)





**Putting it all together**

# Calculating value



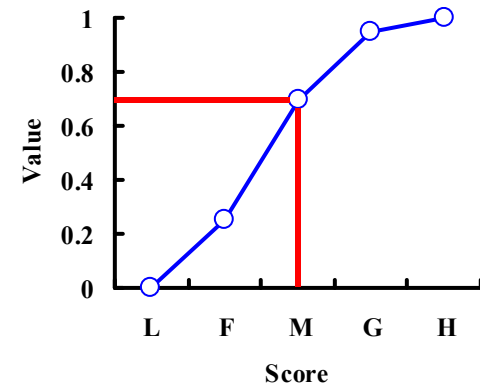
## Scores

| A1      | A2      | A3      |
|---------|---------|---------|
| M       | M       | F       |
| L       | F       | L       |
| M       | H       | M       |
| F       | L       | H       |
|         |         |         |
| L       | M       | L       |
| L       | L       | G       |
| \$142.4 | \$142.4 | \$142.4 |
| \$21.0  | \$21.0  | \$21.0  |
|         |         |         |
| G       | F       | G       |
| F       | L       | H       |
|         |         |         |
| F       | L       | F       |
| G       | M       | L       |
| \$385.0 | \$385.0 | \$385.0 |
| \$14.0  | \$14.0  | \$14.0  |
|         |         |         |
| F       | L       | H       |
| H       | M       | L       |

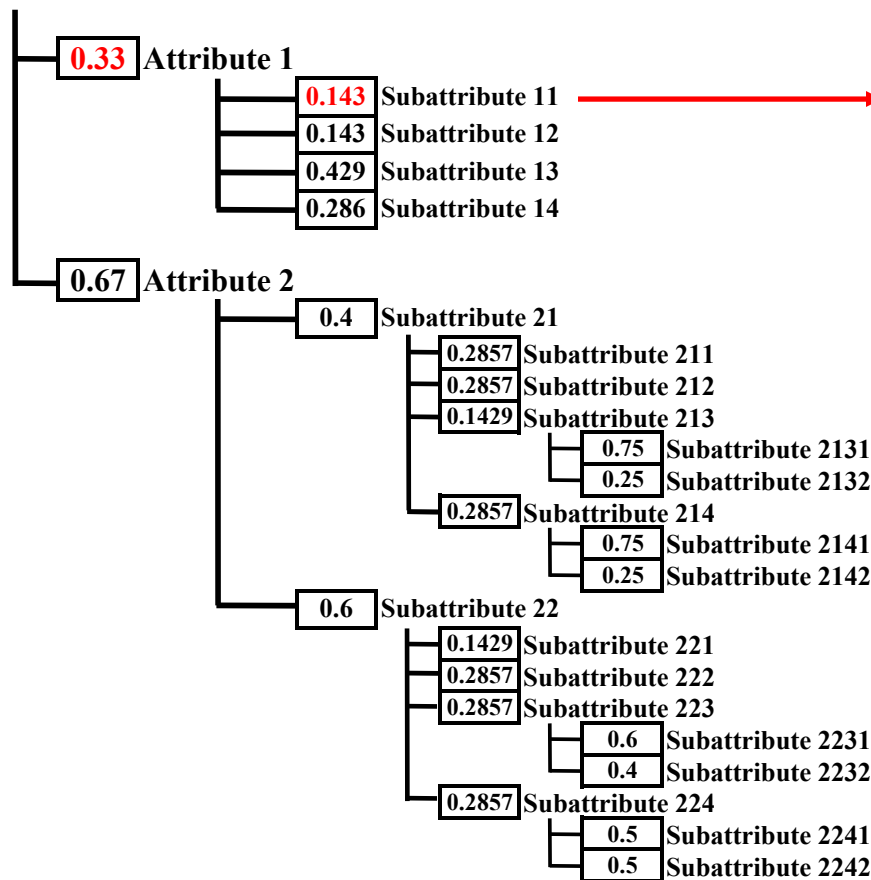
## Values

| A1 | A2 | A3 |
|----|----|----|
|    |    |    |

# Calculating value



Value of mix X



Scores

|         | A2      | A3      |
|---------|---------|---------|
| M       | M       | F       |
| L       | F       | L       |
| M       | H       | M       |
| F       | L       | H       |
| L       | M       | L       |
| L       | L       | G       |
| \$142.4 | \$142.4 | \$142.4 |
| \$21.0  | \$21.0  | \$21.0  |
| G       | F       | G       |
| F       | L       | H       |
| F       | L       | F       |
| G       | M       | L       |
| \$385.0 | \$385.0 | \$385.0 |
| \$14.0  | \$14.0  | \$14.0  |
| F       | L       | H       |
| H       | M       | L       |

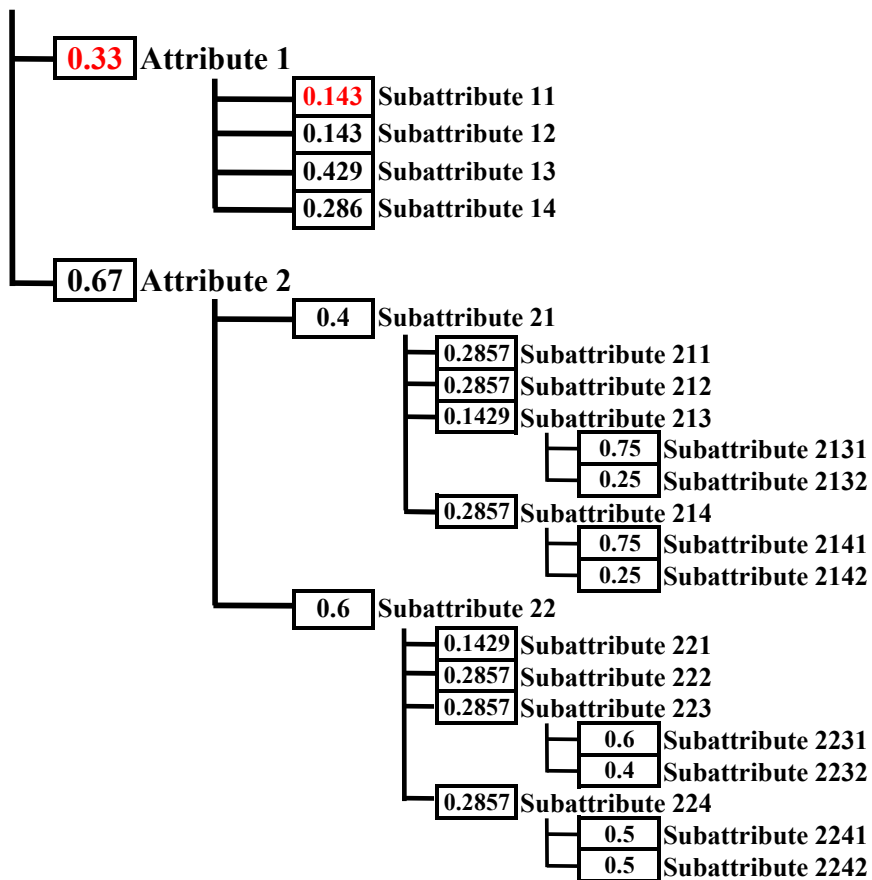
Values

|     | A2 | A3 |
|-----|----|----|
| 0.7 |    |    |

0.0333

# Calculating value

Value of mix X



Scores

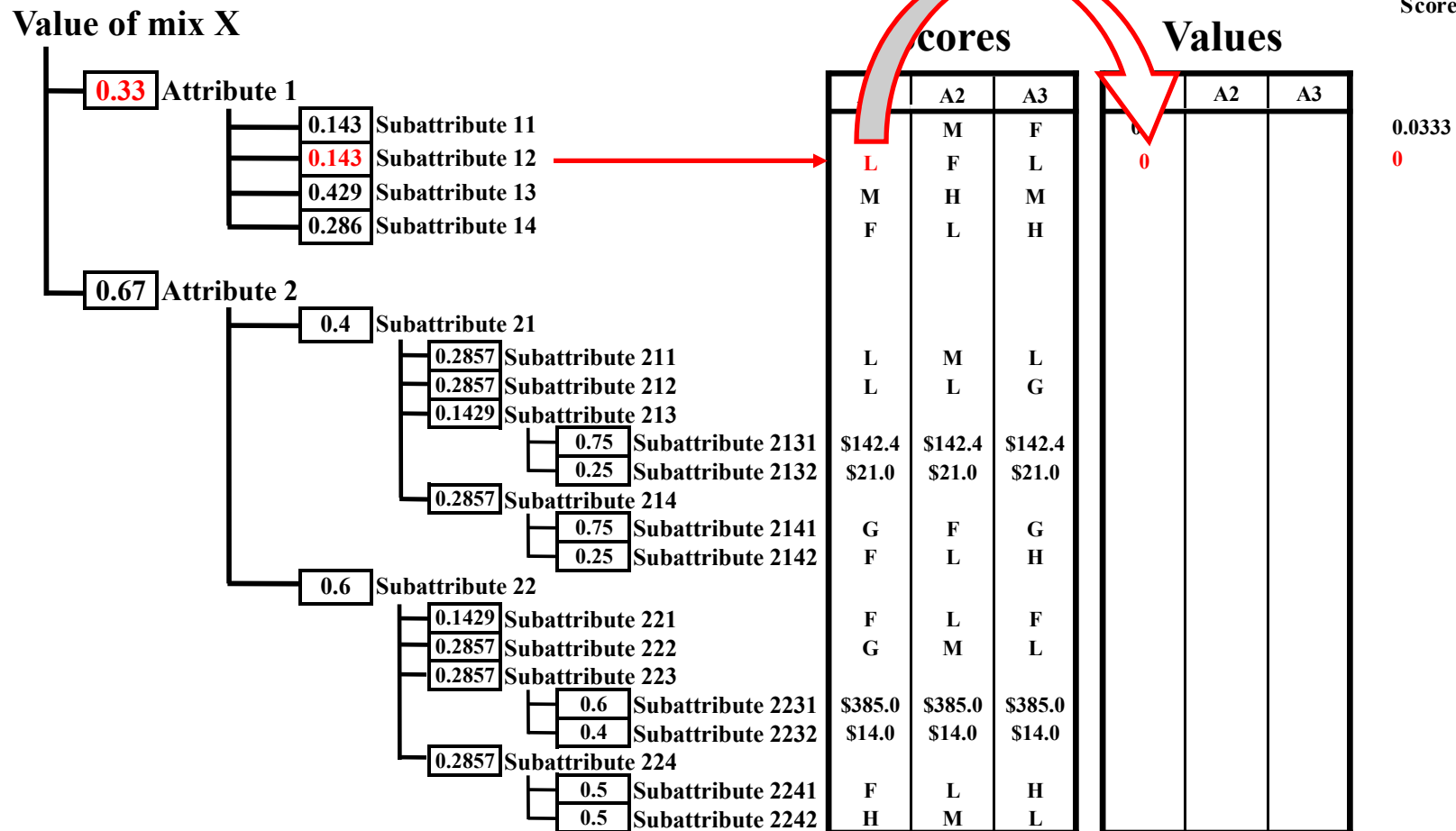
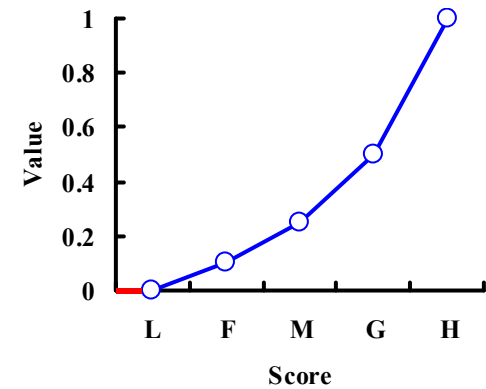
| A1      | A2      | A3      |
|---------|---------|---------|
| M       | M       | F       |
| L       | F       | L       |
| M       | H       | M       |
| F       | L       | H       |
| L       | M       | L       |
| L       | L       | G       |
| \$142.4 | \$142.4 | \$142.4 |
| \$21.0  | \$21.0  | \$21.0  |
| G       | F       | G       |
| F       | L       | H       |
| F       | L       | F       |
| G       | M       | L       |
| \$385.0 | \$385.0 | \$385.0 |
| \$14.0  | \$14.0  | \$14.0  |
| F       | L       | H       |
| H       | M       | L       |

Values

| A1  | A2 | A3 |
|-----|----|----|
| 0.7 |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
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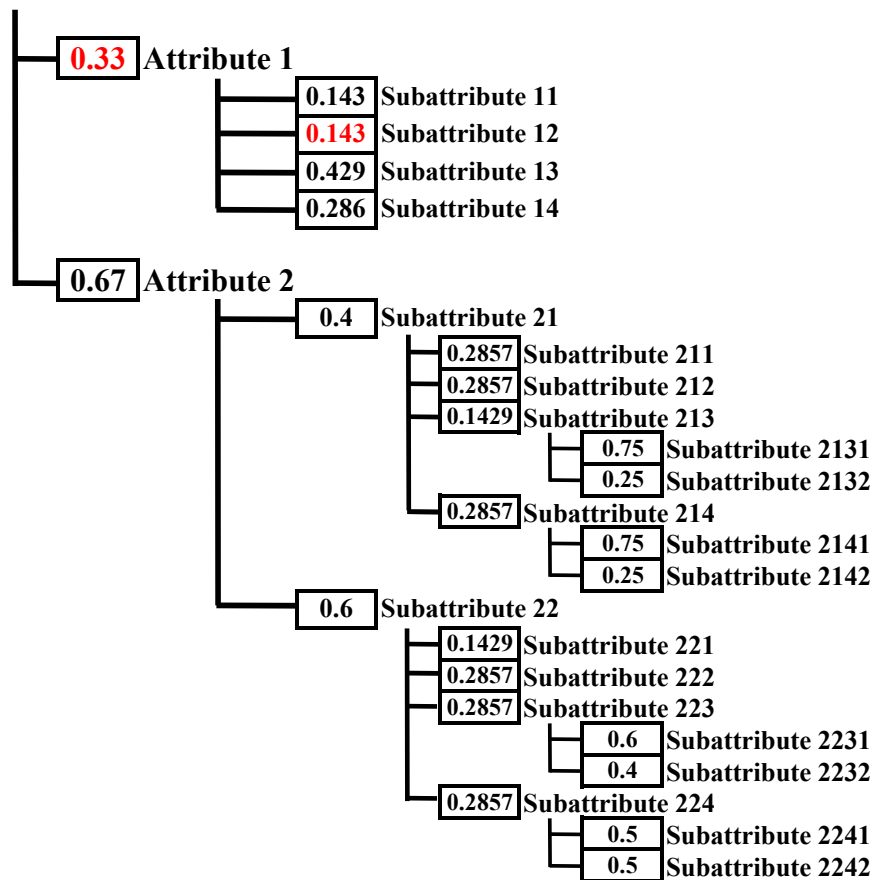
0.0333

# Calculating value



# Calculating value

Value of mix X



Scores

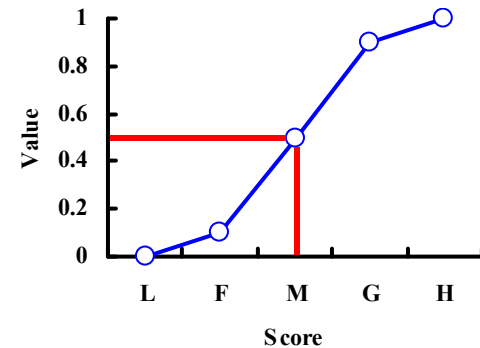
| A1      | A2      | A3      |
|---------|---------|---------|
| M       | M       | F       |
| L       | F       | L       |
| M       | H       | M       |
| F       | L       | H       |
| L       | M       | L       |
| L       | L       | G       |
| \$142.4 | \$142.4 | \$142.4 |
| \$21.0  | \$21.0  | \$21.0  |
| G       | F       | G       |
| F       | L       | H       |
| F       | L       | F       |
| G       | M       | L       |
| \$385.0 | \$385.0 | \$385.0 |
| \$14.0  | \$14.0  | \$14.0  |
| F       | L       | H       |
| H       | M       | L       |

Values

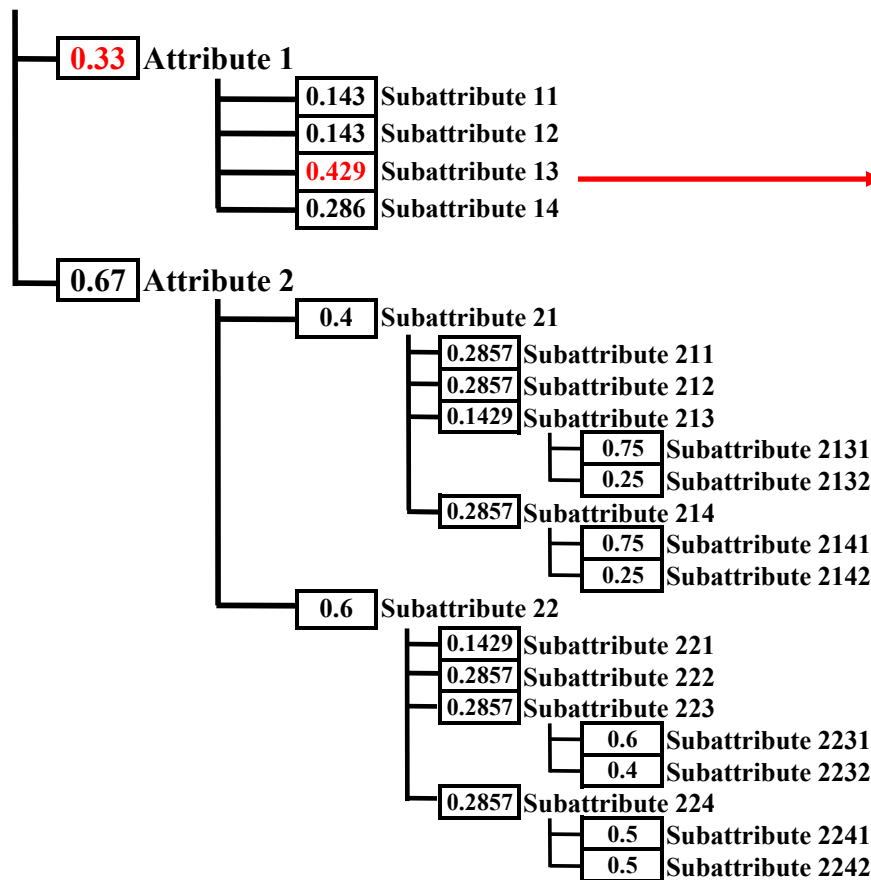
| A1  | A2 | A3 |
|-----|----|----|
| 0.7 |    |    |
| 0   |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |
|     |    |    |

0.0333  
0

# Calculating value



Value of mix X



Scores

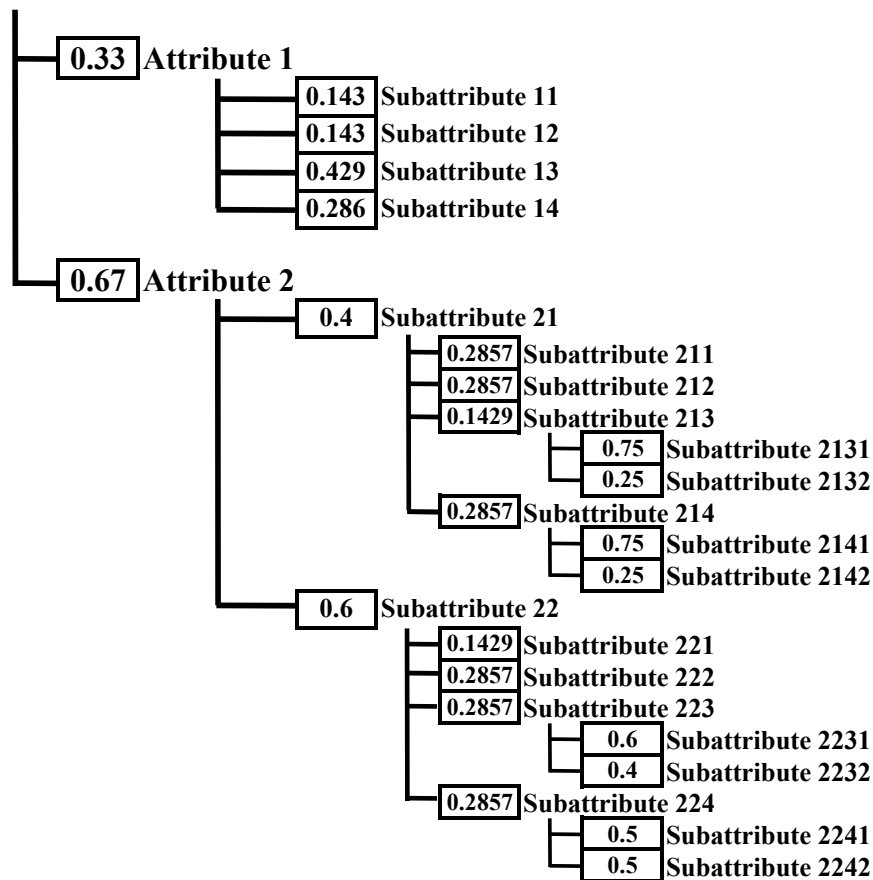
Values

| A1      | A2      | A3      | A1 | A2 | A3 |
|---------|---------|---------|----|----|----|
| M       | M       | F       |    |    |    |
| F       | F       | L       |    |    |    |
| H       | H       | M       |    |    |    |
| L       | L       | H       |    |    |    |
| L       | M       | L       |    |    |    |
| L       | L       | G       |    |    |    |
| \$142.4 | \$142.4 | \$142.4 |    |    |    |
| \$21.0  | \$21.0  | \$21.0  |    |    |    |
| G       | F       | G       |    |    |    |
| F       | L       | H       |    |    |    |
| F       | L       | F       |    |    |    |
| G       | M       | L       |    |    |    |
| \$385.0 | \$385.0 | \$385.0 |    |    |    |
| \$14.0  | \$14.0  | \$14.0  |    |    |    |
| F       | L       | H       |    |    |    |
| H       | M       | L       |    |    |    |

0.0333  
0  
0.0714

# Calculating value

Value of mix X



Scores

| A1      | A2      | A3      |
|---------|---------|---------|
| M       | M       | F       |
| L       | F       | L       |
| M       | H       | M       |
| F       | L       | H       |
| L       | M       | L       |
| L       | L       | G       |
| \$142.4 | \$142.4 | \$142.4 |
| \$21.0  | \$21.0  | \$21.0  |
| G       | F       | G       |
| F       | L       | H       |
| F       | L       | F       |
| G       | M       | L       |
| \$385.0 | \$385.0 | \$385.0 |
| \$14.0  | \$14.0  | \$14.0  |
| F       | L       | H       |
| H       | M       | L       |

Values

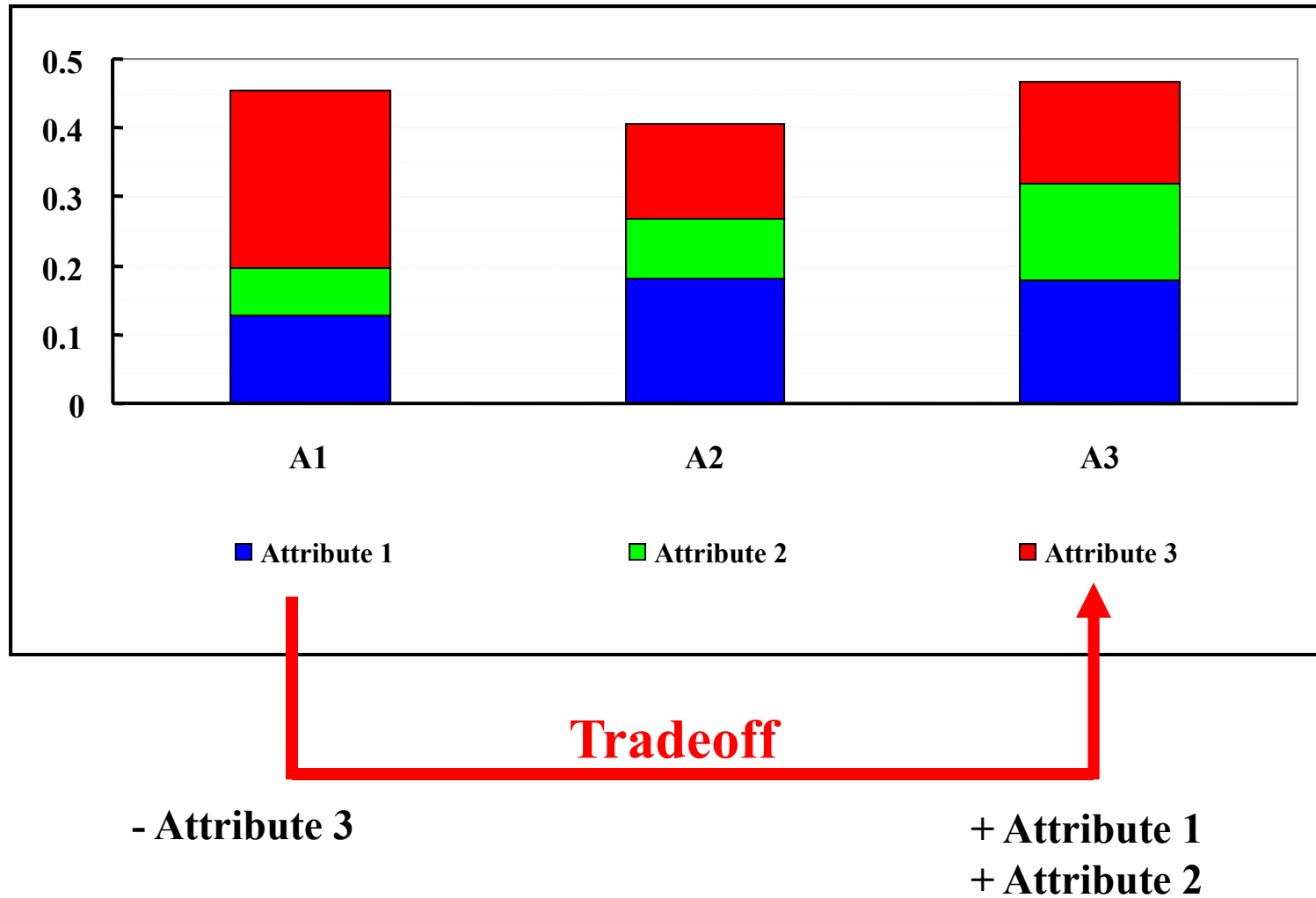
| A1   | A2 | A3 |
|------|----|----|
| 0.7  |    |    |
| 0    |    |    |
| 0.5  |    |    |
| 0.25 |    |    |
| 0    |    |    |
| 0    |    |    |
| 0.75 |    |    |
| 1    |    |    |
| 0.9  |    |    |
| 0.15 |    |    |
| 0.35 |    |    |
| 0.8  |    |    |
| 1    |    |    |
| 1    |    |    |
| 0.35 |    |    |
| 1    |    |    |

0.0333  
0  
0.0714  
0.0238  
  
0  
0  
  
0.0214  
0.0094  
  
0.0529  
0.0029  
  
0.02  
0.914  
  
0.0466  
0.0037  
  
0.02  
0.0571

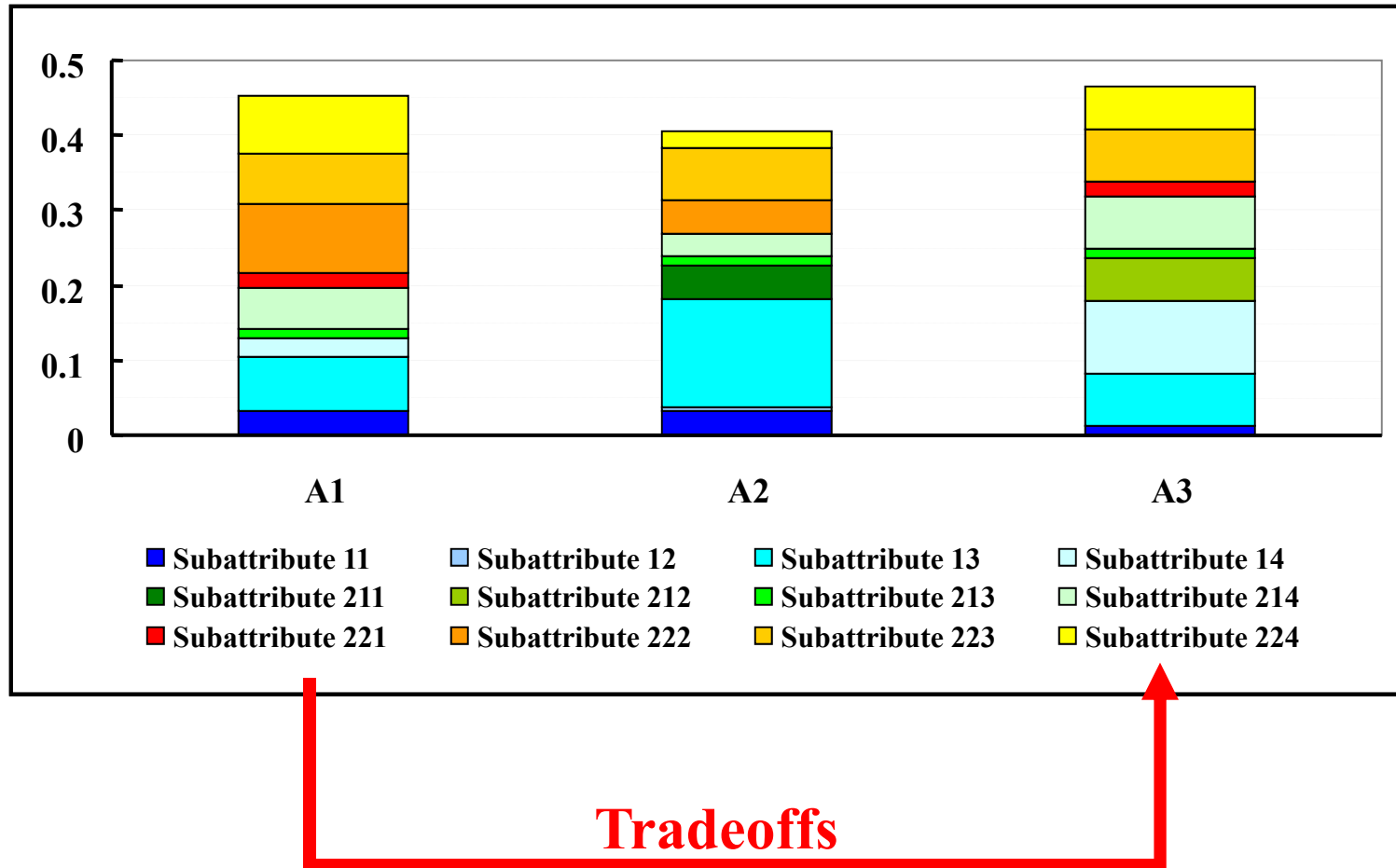
V(A1)  
0.454



# The elements of value



# The elements of value



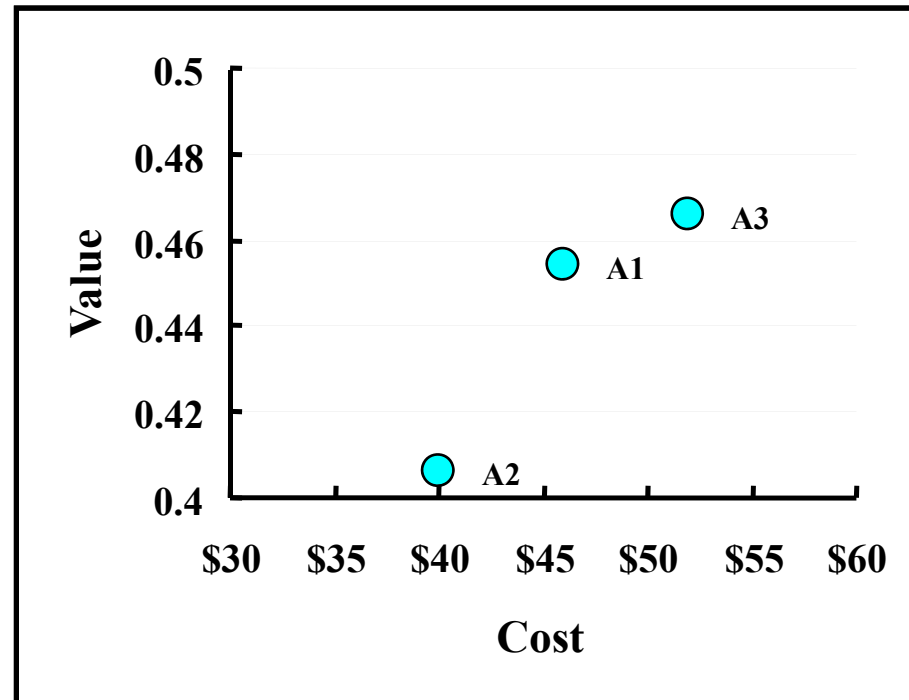
**Bringing in cost**

# The cost-value tradeoff

What about cost?

|    | Cost | MOV     |
|----|------|---------|
| A1 | \$46 | 0.45396 |
| A2 | \$40 | 0.40634 |
| A3 | \$52 | 0.46587 |

Which do you want first?



# The cost-value tradeoff

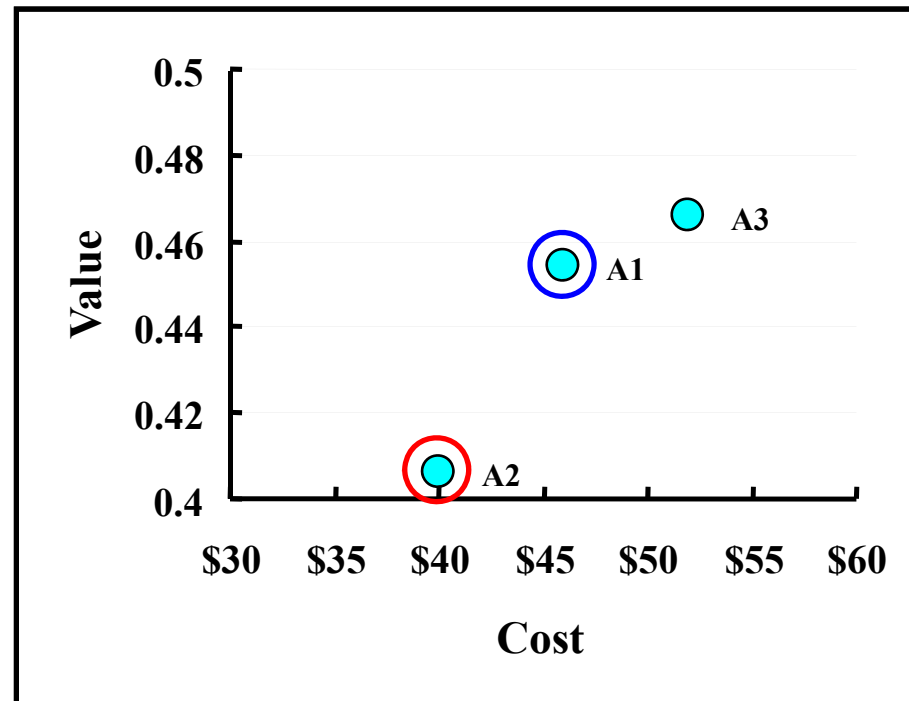
What about cost?

|    | Cost | MOV     | MOV/C   |
|----|------|---------|---------|
| A1 | \$46 | 0.45396 | 0.00987 |
| A2 | \$40 | 0.40634 | 0.01016 |
| A3 | \$52 | 0.46587 | 0.00896 |

Which do you want first?

And next?

If we only had \$100 to spend, we'd "buy" A1 and A2? Right...?

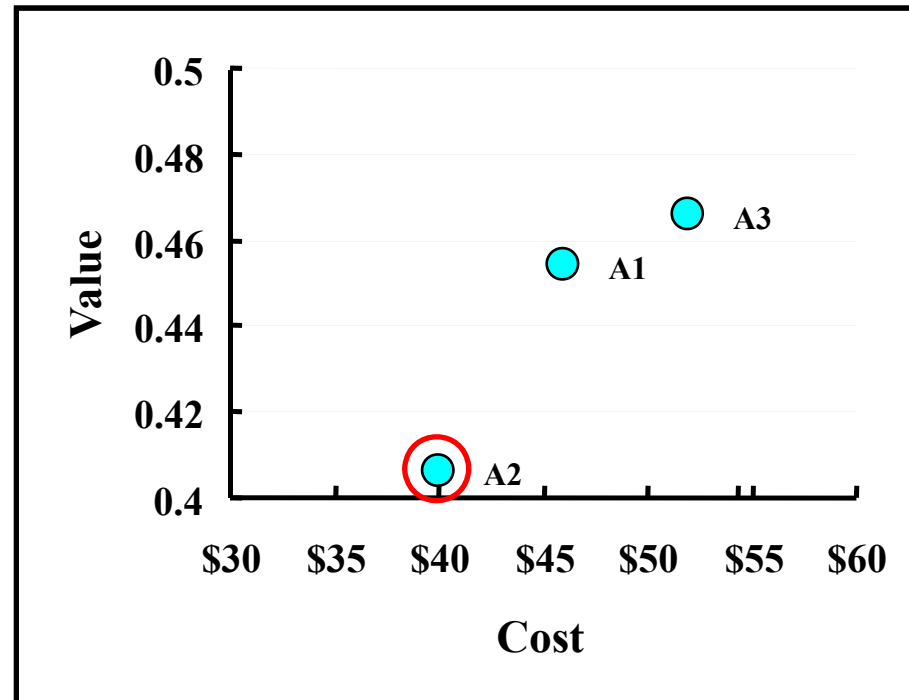


# The cost-value tradeoff

What about cost?

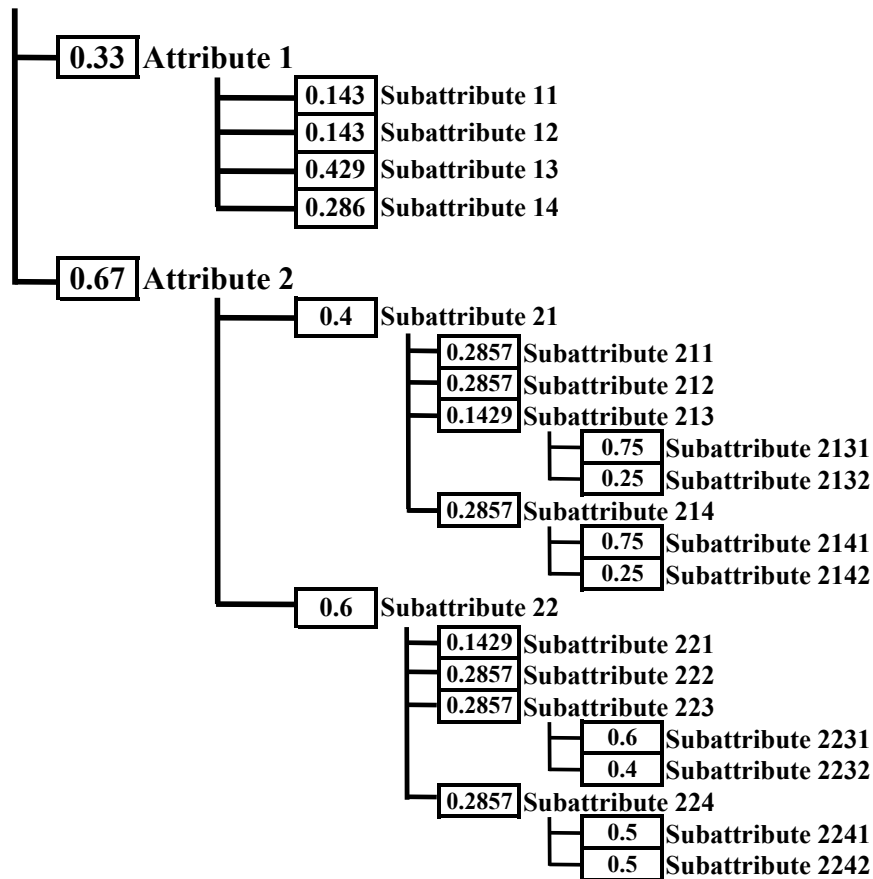
|     | Cost | MOV     | MOV/C   |
|-----|------|---------|---------|
| MO1 | \$46 | 0.45396 | 0.00987 |
| MO2 | \$40 | 0.40634 | 0.01016 |
| MO3 | \$52 | 0.46587 | 0.00896 |

Maybe we should instead ask what we actually gain by spending the additional \$46 on A1?



# The cost-value tradeoff

Value of mix X



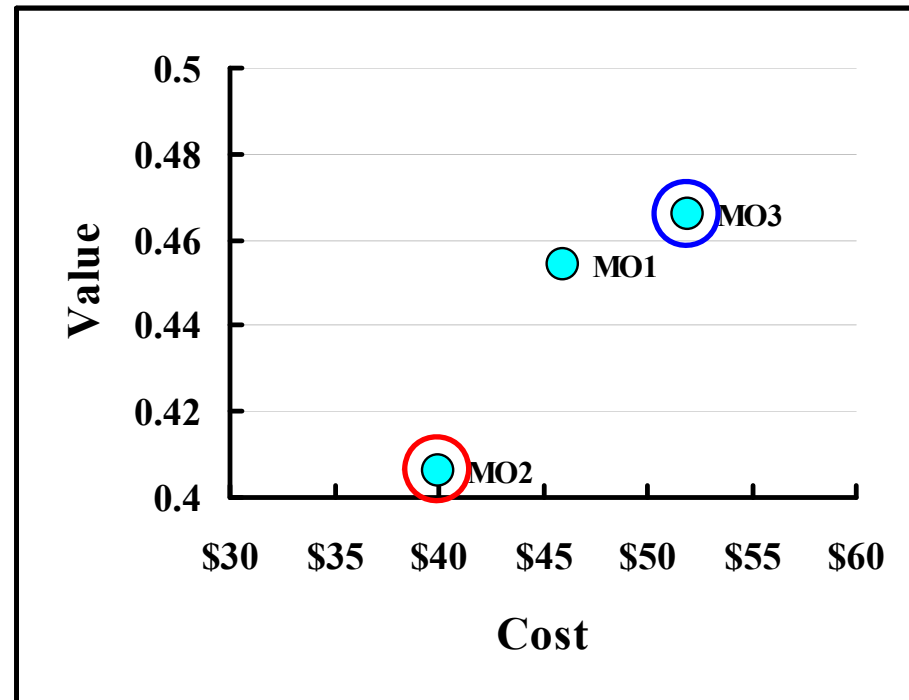
|         |         |         | Marginal Gain |     |     | Marginal Value |        |      |
|---------|---------|---------|---------------|-----|-----|----------------|--------|------|
| A1      | A2      | A3      | A2            | A1  | A3  | A2             | A1     | A3   |
| M       | M       | F       | M             | -   | -   | 0.7            | -      | -    |
| L       | F       | L       | F             | -   | -   | 0.1            | -      | -    |
| M       | H       | M       | H             | -   | -   | 1              | -      | -    |
| F       | L       | H       | L             | L→F | L→H | 0              | 0.25   | 1    |
| L       | M       | L       | M             | -   | -   | 0.6            | -      | -    |
| L       | L       | G       | L             | -   | L→G | 0              | -      | 0.75 |
| \$142.4 | \$142.4 | \$142.4 | \$142.4       | -   | -   | 0.29           | -      | -    |
| \$21.0  | \$21.0  | \$21.0  | \$21.0        | -   | -   | 0.5            | -      | -    |
| G       | F       | G       | F             | F→G | F→G | 0.5            | 0.4    | 0.4  |
| F       | L       | H       | L             | L→F | L→H | 0              | 0.15   | 1    |
| F       | L       | F       | L             | L→F | L→F | 0              | 0.35   | 0.35 |
| G       | M       | L       | M             | M→G | -   | 0.4            | 0.4    | -    |
| \$385.0 | \$385.0 | \$385.0 | \$385.0       | -   | -   | 0.68           | -      | -    |
| \$14.0  | \$14.0  | \$14.0  | \$14.0        | -   | -   | 0.5            | -      | -    |
| F       | L       | H       | L             | L→F | L→H | 0              | 0.35   | 1    |
| H       | M       | L       | M             | M→H | -   | 0.4            | 0.6    | -    |
|         |         |         |               |     |     | 0.1695         | 0.2714 |      |
|         |         |         |               |     |     | \$46           | \$52   |      |
|         |         |         |               |     |     | 0.0037         | 0.0052 |      |

# The cost-value tradeoff

But what about cost?

|     | Cost | MOV     | MOV/C   |
|-----|------|---------|---------|
| MO1 | \$46 | 0.45396 | 0.00987 |
| MO2 | \$40 | 0.40634 | 0.01016 |
| MO3 | \$52 | 0.46587 | 0.00896 |

...so we should “buy” A3 next given the benefits we have already derived from A2!





# **The portfolio game**

# Building an incremental portfolio

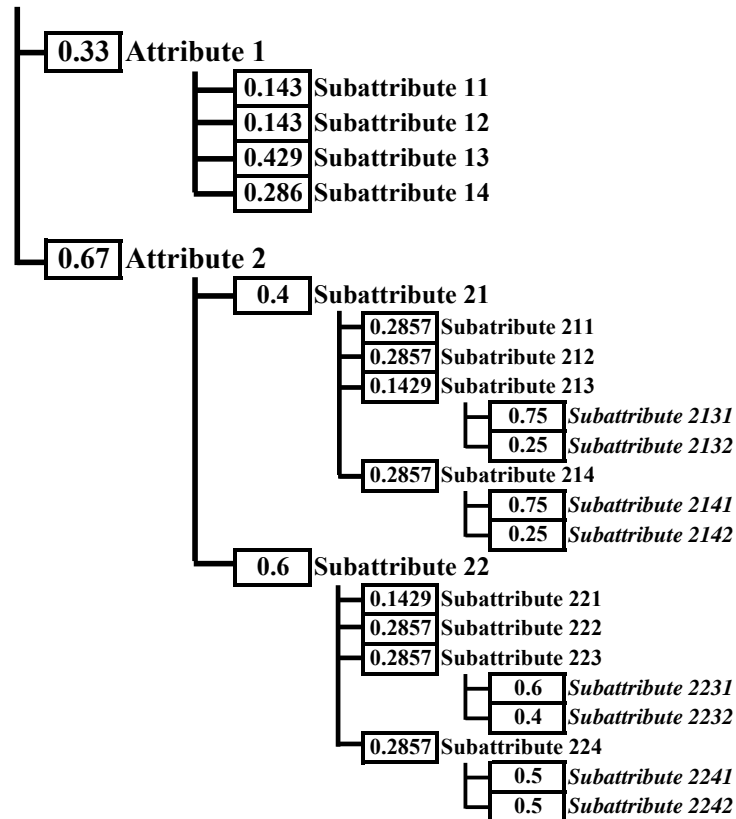
We can construct our portfolio by incrementally adding the most cost-valuable assets. The important issues to consider are:

- ❑ The attribute weights
- ❑ The attribute value functions
- ❑ The reference point for marginal improvement
- ❑ The pesky issue of convexity

# Building an incremental portfolio

Consider the following example...

Value of mix X

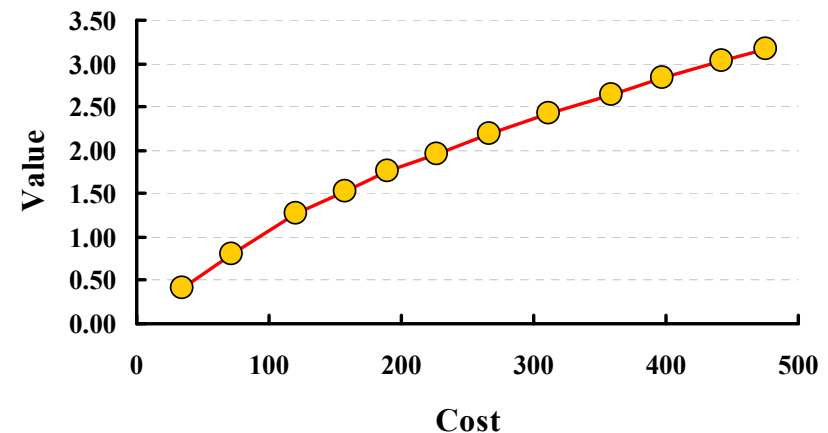
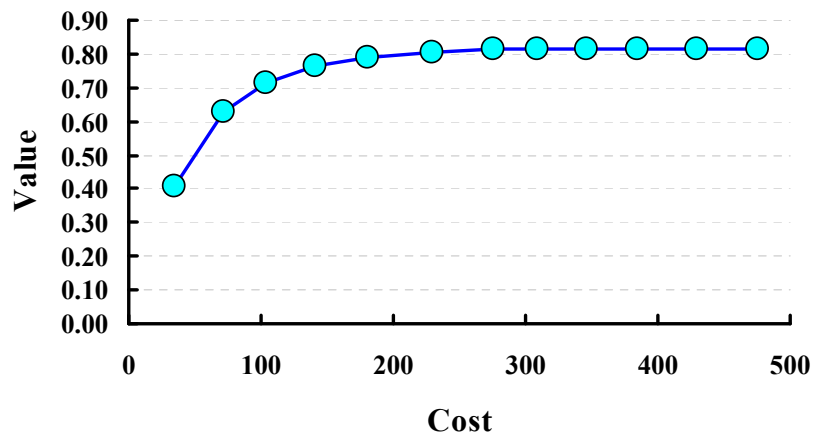


| MO1   | MO2   | MO3   | MO4   | MO5   | MO6   | MO7   | MO8   | MO9   | MO10  | MO11  | MO12  |
|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| L     | L     | L     | L     | L     | L     | F     | F     | F     | H     | M     | L     |
| H     | L     | L     | F     | L     | L     | M     | F     | F     | L     | L     | H     |
| F     | L     | L     | F     | L     | F     | F     | M     | M     | G     | G     | L     |
| F     | F     | M     | M     | L     | L     | L     | L     | L     | L     | F     | H     |
| F     | L     | L     | L     | F     | M     | M     | L     | L     | L     | G     | L     |
| M     | F     | F     | L     | L     | F     | L     | L     | L     | L     | F     | L     |
| \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 | \$141 |
| \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  | \$30  |
| L     | M     | L     | F     | F     | G     | F     | L     | L     | L     | F     | G     |
| F     | L     | L     | L     | L     | L     | F     | L     | L     | L     | F     | L     |
| L     | F     | M     | G     | F     | L     | F     | L     | H     | F     | F     | F     |
| L     | L     | L     | L     | L     | L     | L     | L     | F     | G     | M     | H     |
| \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 | \$243 |
| \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  | \$19  |
| L     | M     | M     | L     | L     | L     | L     | F     | L     | H     | L     | L     |
| F     | L     | M     | G     | L     | M     | L     | F     | L     | L     | G     | L     |
| \$40  | \$37  | \$47  | \$37  | \$34  | \$32  | \$45  | \$38  | \$45  | \$34  | \$49  | \$38  |

# Building an incremental portfolio

Suppose our budget is reduced to \$275. We can no longer afford to “buy” everything. Now we must choose not only which order, but which assets.

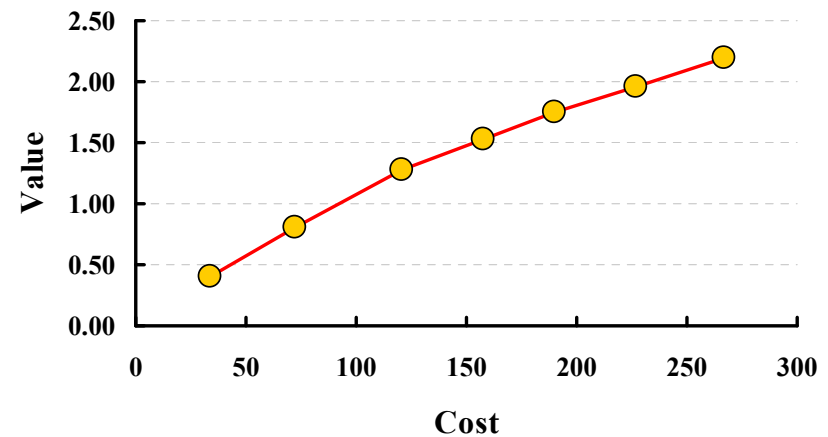
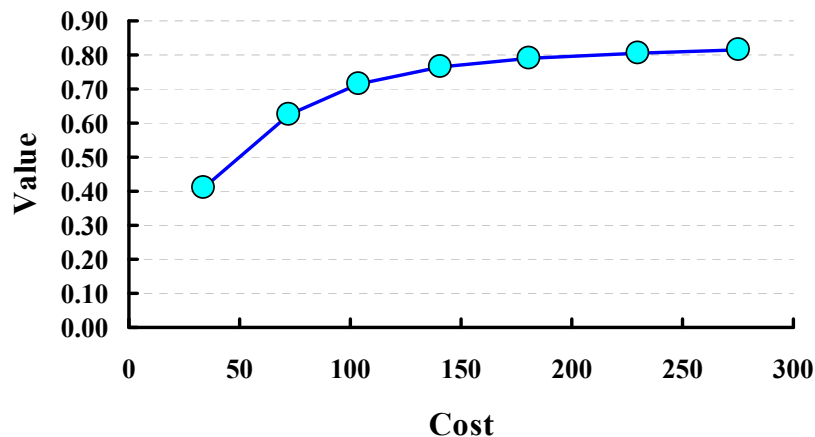
| ALT | Abs | Marg | Marginal |        | Absolute |        |
|-----|-----|------|----------|--------|----------|--------|
|     |     |      | TC       | TV     | TC       | TV     |
| A1  | 7   | 5    | 181.00   | 0.7875 | 267.00   | 2.1878 |
| A2  | 6   | 9    | 346.00   | 0.8151 | 227.00   | 1.9622 |
| A3  | 9   | 12   | 476.00   | 0.8151 | 359.00   | 2.6491 |
| A4  | 4   | 4    | 141.00   | 0.7656 | 158.00   | 1.5339 |
| A5  | 12  | 8    | 309.00   | 0.8151 | 476.00   | 3.1692 |
| A6  | 5   | 3    | 104.00   | 0.7142 | 190.00   | 1.7519 |
| A7  | 11  | 11   | 429.00   | 0.8151 | 442.00   | 3.0331 |
| A8  | 10  | 10   | 384.00   | 0.8151 | 397.00   | 2.8332 |
| A9  | 8   | 7    | 275.00   | 0.8151 | 312.00   | 2.4206 |
| A10 | 1   | 1    | 34.00    | 0.4094 | 34.00    | 0.4094 |
| A11 | 3   | 6    | 230.00   | 0.8066 | 121.00   | 1.2797 |
| A12 | 2   | 2    | 72.00    | 0.6266 | 72.00    | 0.8026 |



# Building an incremental portfolio

Suppose our budget is reduced to \$185. The number of “affordable” assets varies with the acceptance criterion. Is “more” better? What are the opportunity costs?

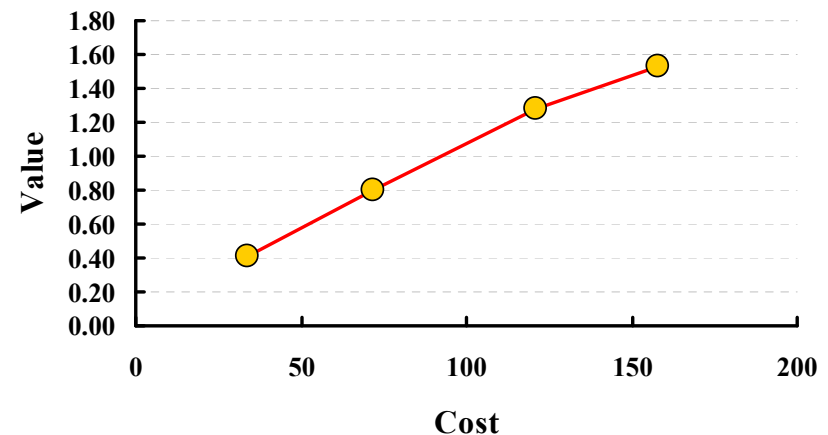
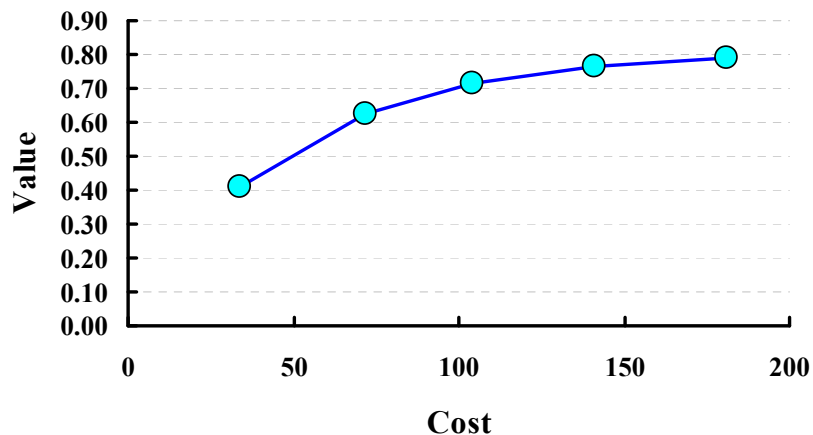
| ALT | Abs | Marg | Marginal |        | Absolute |        |
|-----|-----|------|----------|--------|----------|--------|
|     |     |      | TC       | TV     | TC       | TV     |
| A1  | 7   | 5    | 181.00   | 0.7875 |          |        |
| A2  | 6   |      |          |        | 227.00   | 1.9622 |
| A3  |     |      |          |        |          |        |
| A4  | 4   | 4    | 141.00   | 0.7656 | 158.00   | 1.5339 |
| A5  |     |      |          |        |          |        |
| A6  | 5   | 3    | 104.00   | 0.7142 | 190.00   | 1.7519 |
| A7  |     |      |          |        |          |        |
| A8  |     |      |          |        |          |        |
| A9  |     | 7    |          |        |          |        |
| A10 | 1   | 1    | 34.00    | 0.4094 | 34.00    | 0.4094 |
| A11 | 3   | 6    | 230.00   | 0.8066 | 121.00   | 1.2797 |
| A12 | 2   | 2    | 72.00    | 0.6266 | 72.00    | 0.8026 |



# Building an incremental portfolio

Suppose our budget is reduced to \$185. The number of “affordable” assets varies with the acceptance criterion. Is “more” better? What are the opportunity costs?

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|-----|-----|------|----------|--------|----------|--------|
|     |     |      | TC       | TV     | TC       | TV     |
| A1  |     | 5    | 181.00   | 0.7875 |          |        |
| A2  |     |      |          |        |          |        |
| A3  |     |      |          |        |          |        |
| A4  | 4   | 4    | 141.00   | 0.7656 | 158.00   | 1.5339 |
| A5  |     |      |          |        |          |        |
| A6  |     | 3    | 104.00   | 0.7142 |          |        |
| A7  |     |      |          |        |          |        |
| A8  |     |      |          |        |          |        |
| A9  |     |      |          |        |          |        |
| A10 | 1   | 1    | 34.00    | 0.4094 | 34.00    | 0.4094 |
| A11 | 3   |      |          |        | 121.00   | 1.2797 |
| A12 | 2   | 2    | 72.00    | 0.6266 | 72.00    | 0.8026 |



# So what?

There are two main points:

- ❑ The value of a portfolio derives from the objectives underlying and the environment surrounding its creation.
- ❑ The value of the  $n^{\text{th}}$  asset added to a portfolio should depend on the  $n-1$  assets already included.

# Final notes

## This construct assumes...

- ❑ ... an **optimization** rather than satisficing frame,
- ❑ ... that assets are **independent** and **separable**,
- ❑ ... complete **fungibility** of assets and costs,
- ❑ ... the **criteria for adding an element** to the portfolio (marginal overall value to marginal cost) is valid.

## What happens when...

- ❑ ... the DM changes?
- ❑ ... the information state changes?
- ❑ ... the scenario changes?

*Are these  
necessarily  
“bad” things?*



**The end...?**

# Reconsider the issue

Typical model:

