



University of Missouri

Week 5:

Tradeoffs Step of PrOACT

Instructor: Brielle K Thompson

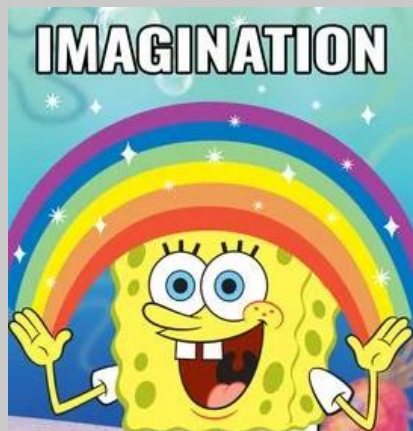
Course: NAT_R 8001 Decision Analysis for Research and
Management of Natural Resources

Review of last week

- Discussed the Alternatives and Consequences step of SDM

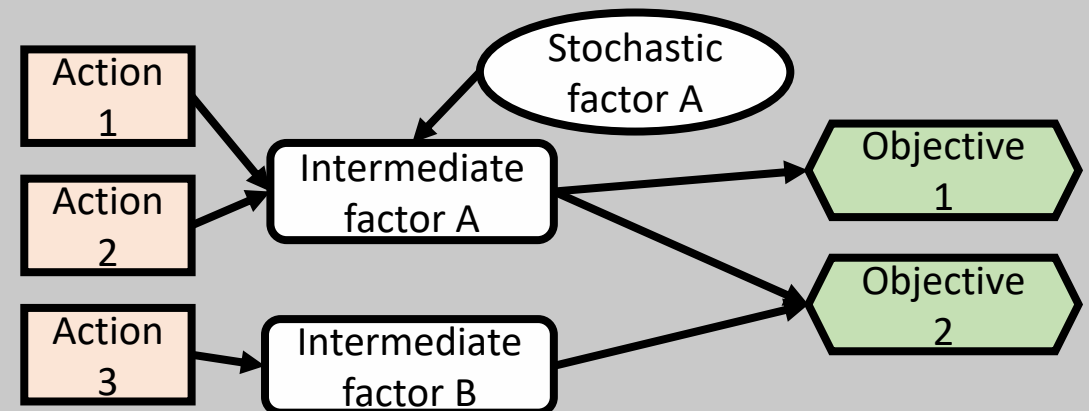
Identifying Alternatives:

1. Focus on fundamental objectives & address conflicting objectives
2. Challenge constraints
3. Create groups of alternatives (portfolios/strategies)
4. Revisit objectives

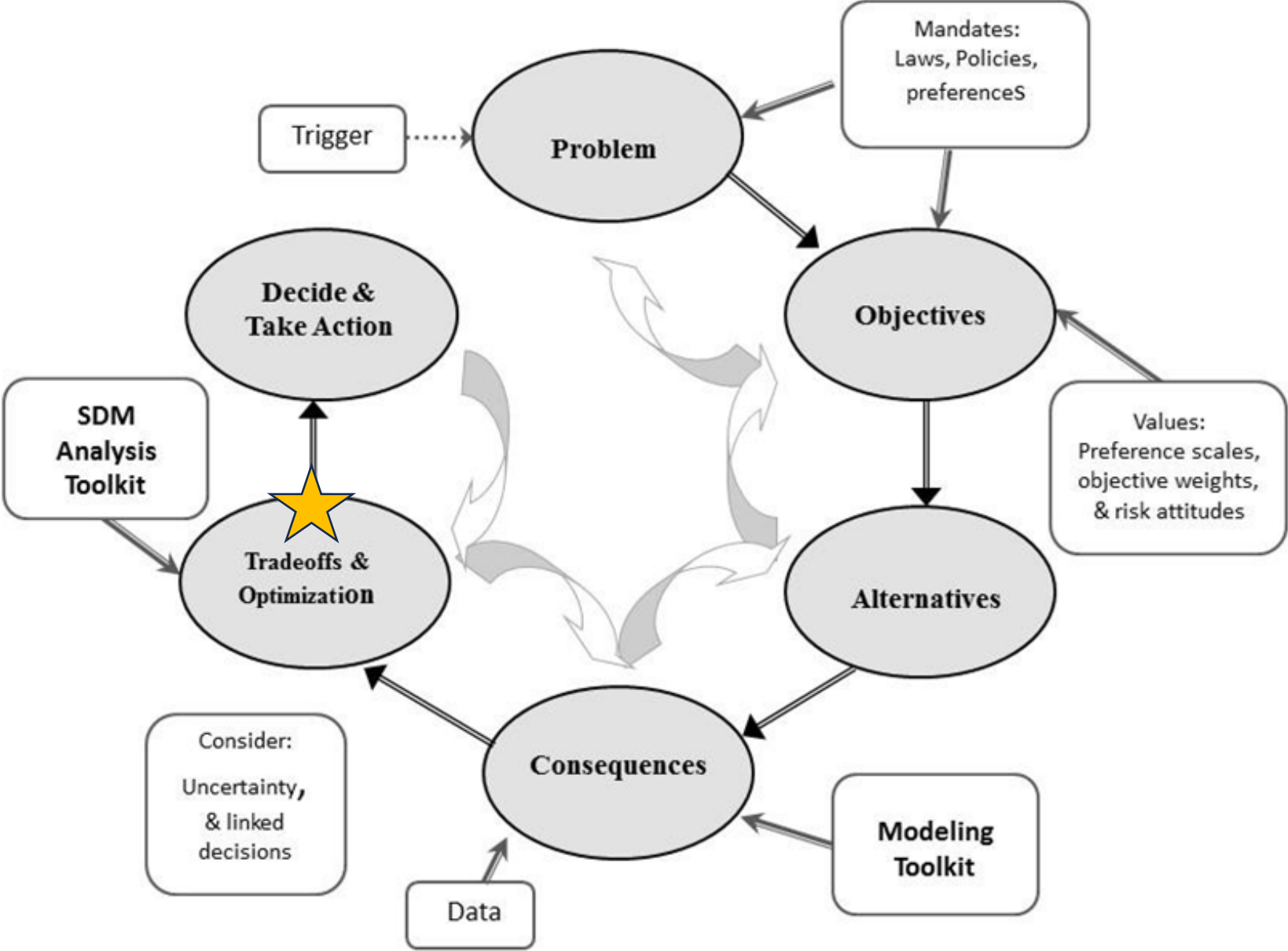


Tips for evaluating consequences:

- Build an influence diagram to help create models
- Identify model type (population model, economic model, expert elicitation, etc.)
- Organize outcomes in a consequence table



Today:
Learn about
the Tradeoffs
step



Source: Jean Fitts Cochrane

Tradeoffs

“How much you would give up on one objective in order to achieve gains on another objective”

- Gregory et al. 2012

Role of analytical methods in tradeoff analysis

- Identify “best” (optimal) solution
 - Ties together alternatives, objectives, and predicted consequences
 - How do you integrate all the components?
- Easiest with a single objective
- Easiest without uncertainty
- Solution method depends on the structure of the problem

Analytical approaches

| | Approach |
|----------------------------|--|
| Single Objective | <ul style="list-style-type: none">• Deterministic optimization |
| Multiple Objectives | <ul style="list-style-type: none">• Multiple Attribute Utility• Simplification• SMART• Pareto frontier analysis |
| | Negotiate among most efficient alternatives |

↓
Increased
complexity

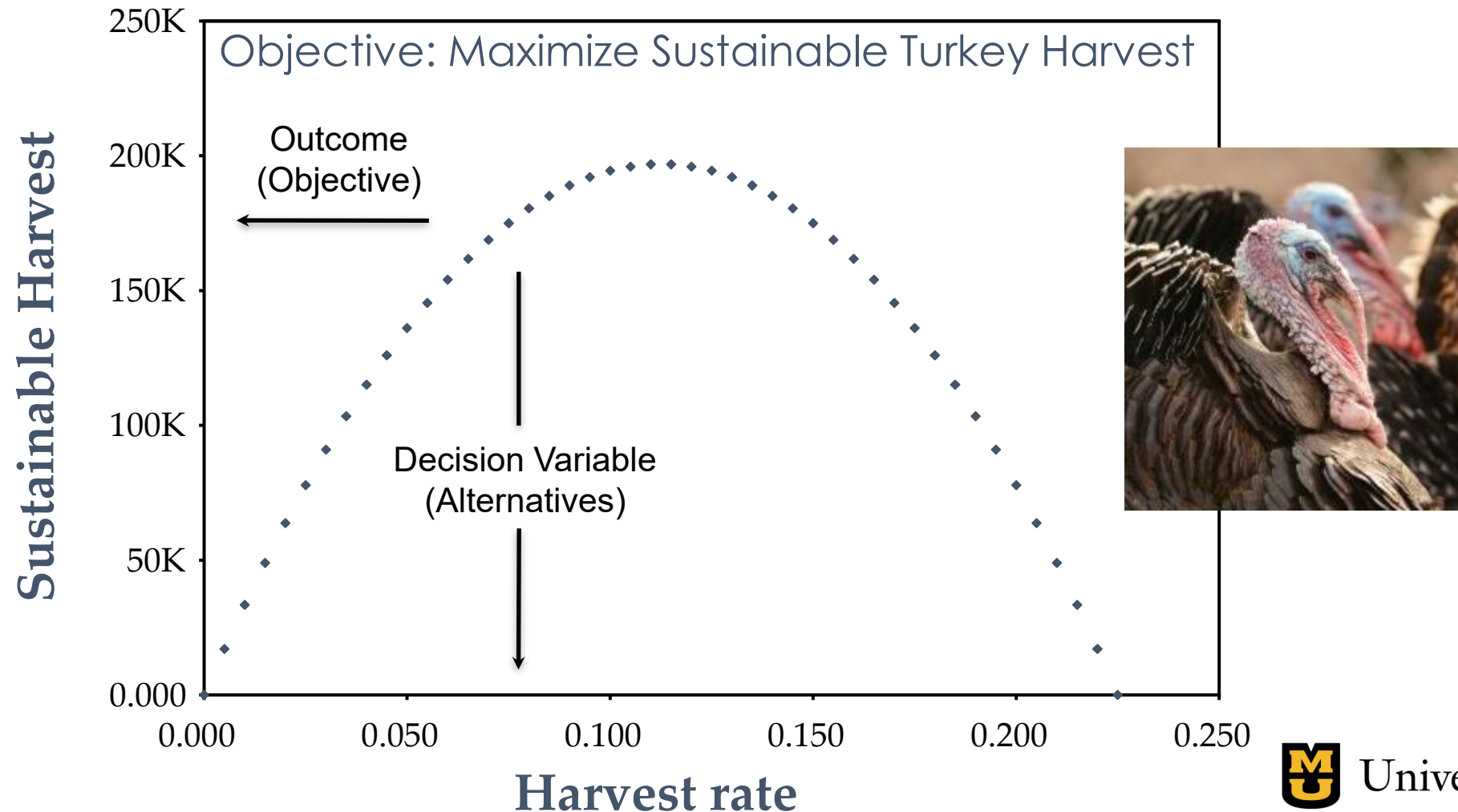


Single objective approach:

- Used when we have a single continuous decision variable (i.e., alternatives)
 - e.g., harvest rate, amount of herbicide to apply, size of biocontrol release, etc.
- Predict outcomes (i.e., objective) are a function of the decision variable
- Optimization solution methods:
 - Graphical
 - Closed-formed solutions (calculus/differentiation)
 - Numerical solutions (mathematical search methods)
 - Constrained optimization (mathematical solution)

Single objective approach:

- Graphical optimization:



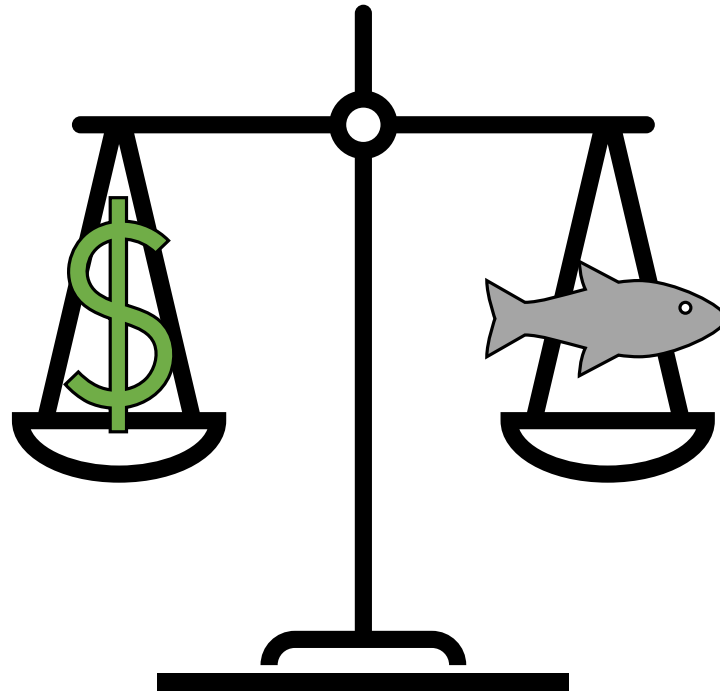
Single objective approach:

Question: Can you think of an example of a single objective problem?

- Not very common in natural resource management.
- Single objectives are easier to optimize, so we may want to reduce multiple objective problems to make them easier to solve.

Multiple objective tools

- Nearly all natural resource management problems are multiple-objective problems



Multiple objective tools

A. Simplify the problem as much as possible

1. Remove dominated alternatives
2. Remove irrelevant objectives
3. Make even swaps

B. Reduce to a single objective if possible

C. Negotiate a solution from a set of best compromises

D. Evaluate trade-offs explicitly

A. Simplify the problem

1. Remove dominated alternatives:

- i.e., another alternative performs the same or better on all objectives

A. Simplify the problem (EXAMPLE)

1. Remove dominated alternatives (another alternative performs the same or better on all objectives)

| Objectives | Direction | Alternatives | | | |
|----------------------------------|-----------|--------------|--------------|--------------|----------|
| | | Status quo | Minor repair | Major repair | Re-build |
| Cost (\$M) | Min | | | | |
| Environmental Benefit (0-10) | Max | | | | |
| Disturbance (0-10) | Min | | | | |
| Silt runoff (k ft ³) | Min | | | | |
| Water Retention (MG) | Max | | | | |

A. Simplify the problem (EXAMPLE)

1. Remove dominated alternatives (another alternative performs the same or better on all objectives)

| Objectives | Direction | Alternatives | | | |
|----------------------------------|-----------|--------------|--------------|--------------|----------|
| | | Status quo | Minor repair | Major repair | Re-build |
| Cost (\$M) | Min | 0 | 2 | 12 | 20 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 | 10 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 | 3 |
| Water Retention (MG) | Max | 41 | 41 | 41 | 39 |

A. Simplify the problem (EXAMPLE)

1. Remove dominated alternatives (another alternative performs the same or better on all objectives)

| Objectives | Direction | Alternatives | | | Dominated Alternative |
|----------------------------------|-----------|--------------|--------------|--------------|-----------------------|
| | | Status quo | Minor repair | Major repair | Re-build |
| Cost (\$M) | Min | 0 | 2 | 12 | 20 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 | 10 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 | 3 |
| Water Retention (MG) | Max | 41 | 41 | 41 | 39 |

A. Simplify the problem

1. Remove dominated alternatives:

- i.e., another alternative performs the same or better on all objectives

2. Remove irrelevant objectives:

- i.e., performance measures of that objective does not vary over alternatives
- This isn't to say the objective isn't important to you, just that it doesn't help discern among the alternatives currently considered.

A. Simplify the problem (EXAMPLE)

2. Remove irrelevant objective

| Objectives | Direction | Alternatives | | | |
|----------------------------------|-----------|--------------|--------------|--------------|----------|
| | | Status quo | Minor repair | Major repair | Re-build |
| Cost (\$M) | Min | 0 | 2 | 12 | 20 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 | 10 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 | 3 |
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Dominated Alternative

A. Simplify the problem (EXAMPLE)

2. Remove irrelevant objective

| Objectives | Direction | Alternatives | | | |
|----------------------------------|----------------------|--------------|--------------|--------------|----------|
| | | Status quo | Minor repair | Major repair | Re-build |
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| Disturbance (0-10) | Min | 0 | 1 | 7 | 10 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 | 3 |
| Water Retention (MG) | Irrelevant Objective | 41 | 41 | 41 | 39 |

Dominated Alternative

A. Simplify the problem (EXAMPLE)

- **Simplified problem:**

| Objectives | Direction | Alternatives | | |
|----------------------------------|-----------|--------------|--------------|--------------|
| | | Status quo | Minor repair | Major repair |
| Cost (\$M) | Min | 0 | 2 | 12 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 |

A. Simplify the problem

1. Remove dominated alternatives:

- i.e., another alternative performs the same or better on all objectives

2. Remove irrelevant objectives:

- i.e., performance measures of that objective does not vary over alternatives
- This isn't to say the objective isn't important to you, just that it doesn't help discern among the alternatives currently considered.

3. Make even swaps:

- If two objectives are in the same unit, then combine outcomes

A. Simplify the problem (EXAMPLE)

3. Even swaps

Convert silt runoff to cost @ \$0.5M / k ft³

| Objectives | Direction | Alternatives | | |
|----------------------------------|-----------|--------------|--------------|--------------|
| | | Status quo | Minor repair | Major repair |
| Cost (\$M) | Min | 0 | 2 | 12 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 |
| Silt runoff (k ft ³) | Min | 5 | 1 | 3 |



A. Simplify the problem (EXAMPLE)

3. Even swaps

Convert silt runoff to cost @ \$0.5M / k ft³

| Objectives | Direction | Alternatives | | |
|----------------------------------|-----------|--------------------|--------------------|--------------------|
| | | Status quo | Minor repair | Major repair |
| Cost (\$M) | Min | 0 | 2 | 12 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 |
| Silt runoff (k ft ³) | Min | 5 2.5 M | 4 0.5 M | 3 1.5 M |

A. Simplify the problem (EXAMPLE)

3. Even swaps

Convert silt runoff to cost @ \$0.5M / k ft³

| Objectives | Direction | Alternatives | | |
|----------------------------------|-----------|--------------|--------------|--------------|
| | | Status quo | Minor repair | Major repair |
| Cost (\$M) | Min | 0 + 2.5 | 2 + 0.5 | 12 + 1.5 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 |
| Silt runoff (k ft ³) | | | | |



B. Reduce to a single objective

- Tip: Convert all objectives but one to constraints
 - Example: don't spend more than \$2.5M
 - Keep disturbance at or below 3
 - Then take the maximum environmental benefit

| Objectives | Direction | Alternatives | | |
|------------------------------|-----------|--------------|--------------|--------------|
| | | Status quo | Minor repair | Major repair |
| Cost (\$M) | Min | 2.5 | 2.5 | 13.5 |
| Environmental Benefit (0-10) | Max | 1 | 3 | 10 |
| Disturbance (0-10) | Min | 0 | 1 | 7 |



Activity: Evaluate tradeoffs

Hint: Are there any irrelevant objectives, dominated outcomes, even swaps?

Objective [measurable attribute] {Direction}

| | Alternative | Respect Life | HBC Recovery | Wilderness Disturbance | Cost |
|----------|----------------------|---------------------|---------------------|-------------------------------|-------------|
| | | [0-10 scale] | [P(N>6000)] | [User-days] | [M\$/5-yr] |
| | | {Max} | {Max} | {Min} | {Min} |
| A | No action | 6 | 0.2 | 0 | 0 |
| B | Alternative B | 7 | 0.3 | 30 | 2.5 |
| C | Alternative C | 6 | 0.3 | 40 | 3 |
| D | Alternative D | 9.5 | 0.3 | 50 | 4.5 |
| E | Alternative E | 9 | 0.25 | 60 | 2 |

The consequence table was inspired by Runge et al. 2011
but the values in the table were altered for simplicity



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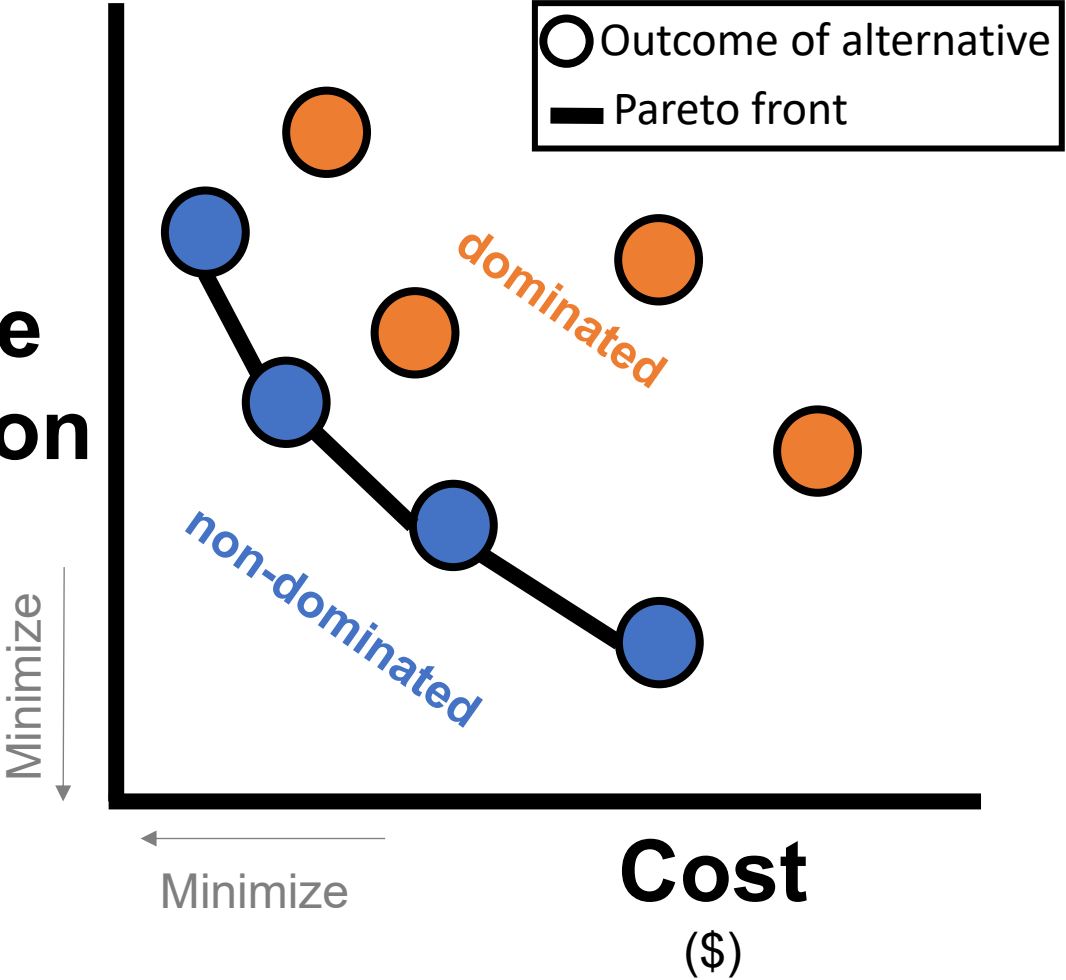
C. Negotiate a solution from a set of best compromises

With \geq two objectives we can do **pareto frontier analysis**

Pareto optimal alternative (non-dominated or 'efficient')
outcome on one objective cannot be improved without a reduction in another objective

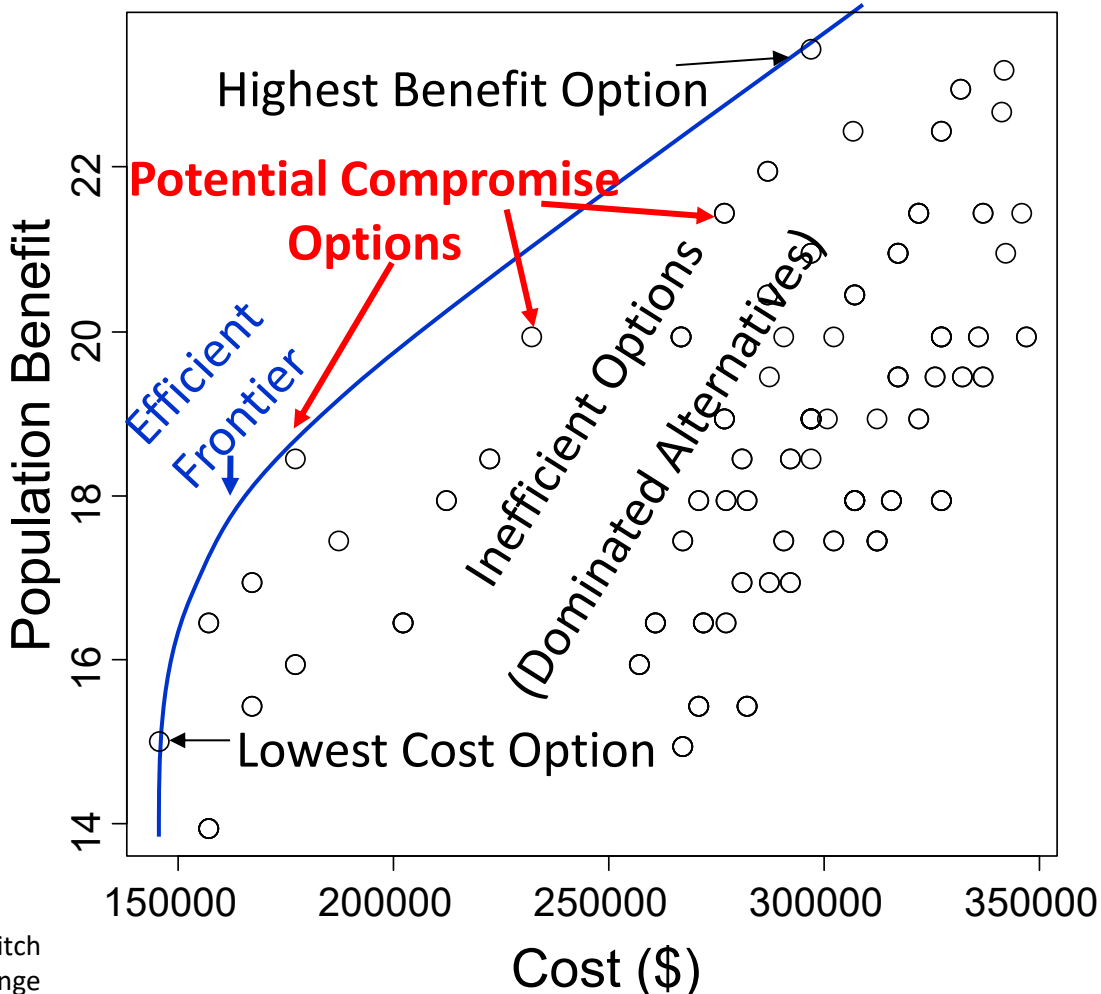
Pareto inefficient alternative (dominated alternative or 'not efficient')
Another alternative performs at least as well on all objectives and performs strictly better on at least one

Invasive population (#)



C. Negotiate a solution from a set of best compromises

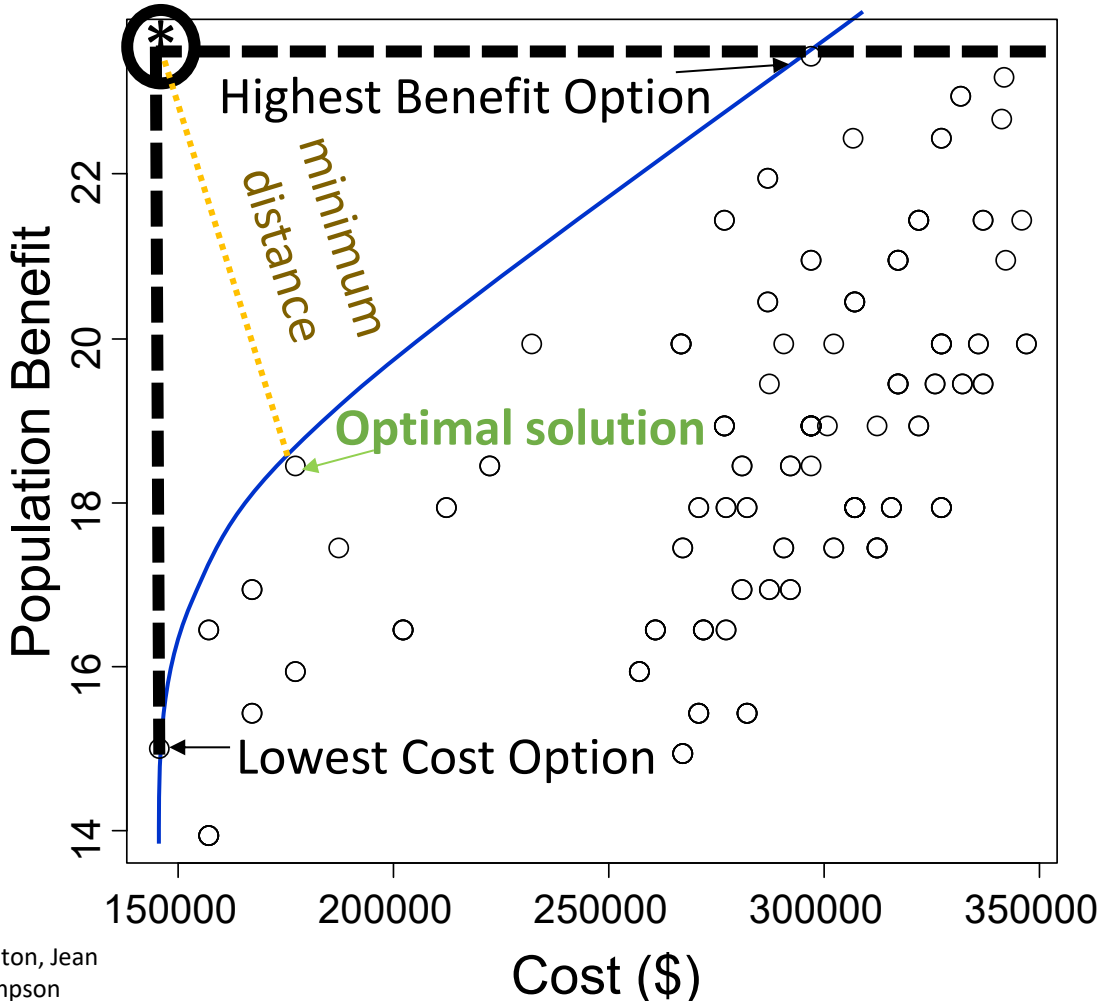
Example: Cost vs Population Benefit



○ = outcome of each alternative

C. Negotiate a solution from a set of best compromises

Example: Cost vs Population Benefit



○ = outcome of each alternative

If cost and population benefit are deemed equal, we can find the **optimal solution** as the minimum distance between the ideal point (*)






Example: Consequence table + tradeoffs

| Alternative management strategy, no. segments of removal effort | Objective (expected value) | | | Dominated by X Alternative |
|--|----------------------------|-----------------|--------------------------|----------------------------|
| | Suppression (in millions) | Containment (%) | Prevention (in millions) | |
| No removals, 0 | 21.13 M | 90.3% | 1.15 M | None |
| Abundance, 1 | 20.52 M | 90.2% | 1.15 M | None |
| Growth, 1 | 20.83 M | 89.7% | 1.15 M | None |
| Edges, 1 | 20.68 M | 90.0% | 0.83 M | None |
| Downstream, 1 | 20.81 M | 90.1% | 0.48 M | None |
| Random, 1 | 20.61 M | 90.0% | 1.10 M | None |
| Abundance, 4 | 18.82 M | 89.6% | 1.14 M | None |
| Growth, 4 | 20.05 M | 87.2% | 1.01 M | Downstream, 4 |
| Edges, 4 | 19.24 M | 88.1% | 0.48 M | None |
| Downstream, 4 | 19.37 M | 86.2% | 0.18 M | None |
| Random, 4 | 19.00 M | 88.6% | 0.96 M | None |
| Abundance, 8 | 16.67 M | 85.7% | 1.02 M | None |
| Growth, 8 | 18.34 M | 83.1% | 0.58 M | Downstream, 8 |
| Edges, 8 | 17.92 M | 85.1% | 0.31 M | Downstream, 8 |
| Downstream, 8 | 17.32 M | 81.4% | 0.15 M | None |
| Random, 8 | 16.93 M | 85.7% | 0.83 M | None |
| Abundance, 16 | 11.81 M | 74.1% | 0.67 M | None |
| Growth, 16 | 14.25 M | 72.9% | 0.22 M | Edges, 16 |
| Edges, 16 | 14.24 M | 71.4% | 0.22 M | None |
| Downstream, 16 | 13.17 M | 73.7% | 0.15 M | None |
| Random, 16 | 12.78 M | 78.3% | 0.56 M | None |

Example: Consequence table + tradeoffs

Subset of the table: management alternatives to control invasive rusty crayfish

4 alternatives to compare

| Alternative management strategy, no. segments of removal effort | Objective (expected value) | | | Dominated by X Alternative |
|---|----------------------------|-----------------|--------------------------|----------------------------|
| | Suppression (in millions) | Containment (%) | Prevention (in millions) | |
| Abundance, 8  | 16.67 M | 85.7% | 1.02 M | None |
| Growth, 8  | 18.34 M | 83.1% | 0.58 M | Downstream, 8 |
| Edges, 8  | 17.92 M | 85.1% | 0.31 M | Downstream, 8 |
| Downstream, 8  | 17.32 M | 81.4% | 0.15 M | None |
| Random, 8  | 16.93 M | 85.7% | 0.83 M | None |

Best in having low # of crayfish
(suppression objective)

*But worse than Downstream, 8 in the other 2 objectives

Best alternative in having low % coverage of crayfish & low # of crayfish entering an important area
(Containment & Prevention objectives)

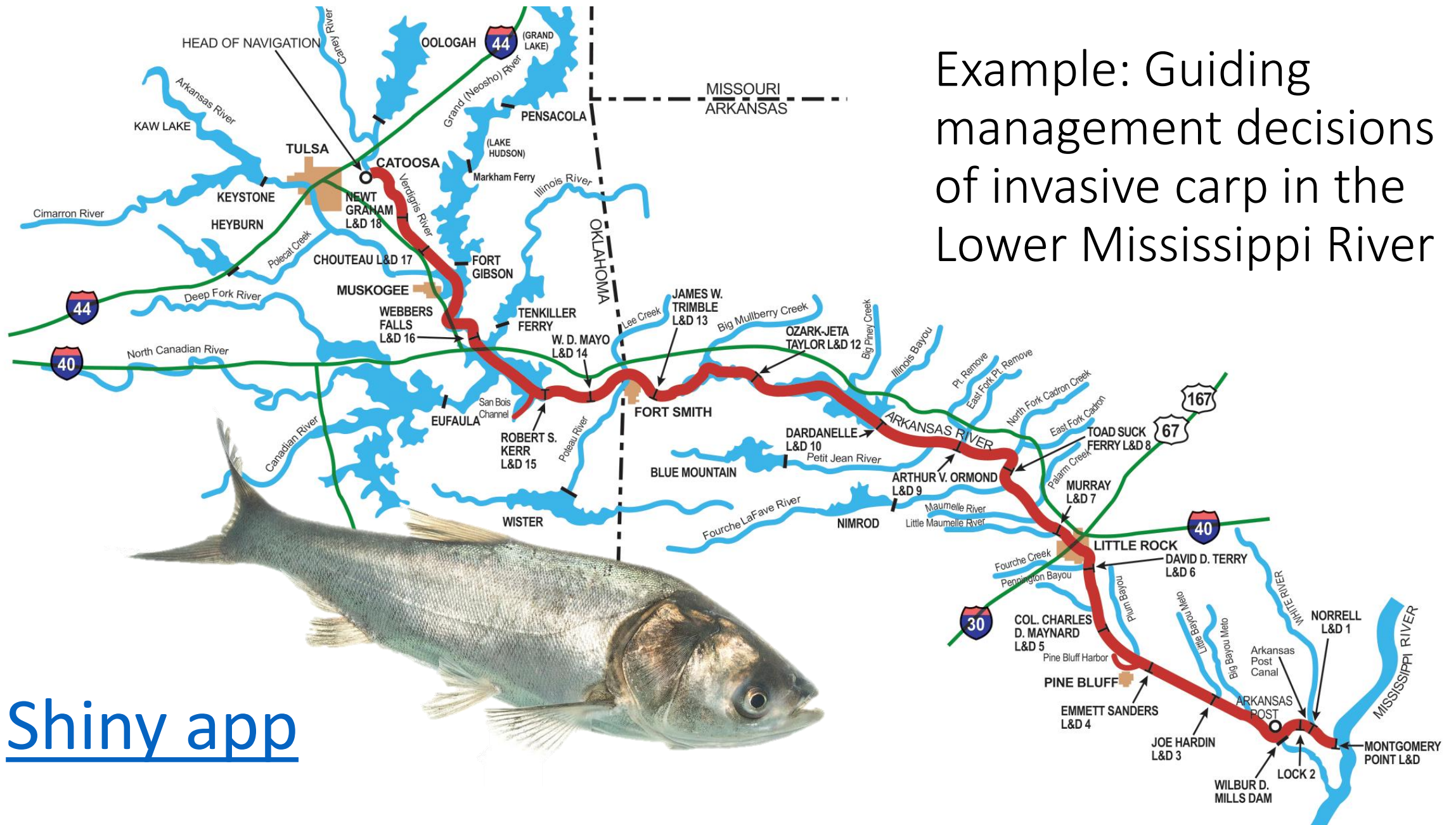
*But worse than Abundance, 8 in the first objective

“Middle ground outcome”

Better than Abundance, 8 in Prevention & better than Downstream, 8 in Suppression

Means we should not conduct Growth, 8 or Edges, 8

Example: Guiding management decisions of invasive carp in the Lower Mississippi River



Shiny app

D. Evaluate trade-offs explicitly

- Multicriteria decision analysis:
 - Offers tools to evaluate multiple objective problems
- A variety of tools exist (beyond the scope of this workshop)
 - Outranking methods
 - Analytic Hierarchy Process
 - Multi-attribute value/utility theory
 - SMART (simple multi-attribute rating technique)
- *See this week's reading for more examples*

3-minute intro to MCDA



- KEY STEPS OF MCDA**
1. DEFINE OBJECTIVE
 2. DEFINE CRITERIA
MEASURES FOR SUCCESS
 3. WEIGHT OF CRITERIA
 4. LIST THE OPTIONS
 5. RATE OPTIONS

SMART (simple multi-attribute rating technique)

1. Normalize all attributes to 0-1 scale within each objective

For Goal to Maximize the attribute:

$$(x - \text{minimum}) / (\text{maximum} - \text{minimum})$$

For Goal to Minimize the attribute:

$$1 - (x - \text{minimum}) / (\text{maximum} - \text{minimum})$$

2. Assign weights to each fundamental objective

3. Calculate weighted sum of scores for each alternative

4. Recommend alternative with highest weighted score

5. Sensitivity analysis! (Is the recommendation sensitive to the weights and predictions?)

Activity: SMART Practice

EXCEL LINK

- Given our simplified impoundment repair problem (see consequence table), solve it using SMART for two different sets of weights:
 - Weights for cost/environmental benefit/disturbance are: 0.6, 0.3, 0.1
 - Weights for cost/environmental benefit/disturbance are: 0.2, 0.6, 0.2
- What if my weights are 0.6, 0.3, 0.1, but I am uncertain about the environmental benefit of the minor repair? It could be as small as 1 or as large as 5. Is my decision sensitive to this uncertainty?



Where do objective weights come from?

- Represent relative *values* of a decision maker
- Some methods
 - Direct elicitation- importance weights
 - Swing weighting
 - Pairwise weighting (AHP)
- Weights are context-dependent
 - If you change the range of predictions for an attribute, its weight may need to change



Importance weights

- These reflect the **relative importance** of each criterion in a decision-making process and are used in SMART
- Example:

| | Weight | Translocations | Habitat Restoration |
|---------------------------|--------|----------------|---------------------|
| Maximize Pr (persistence) | 0.9 | 0.5 | 0.9 |
| Minimize cost | 0.1 | \$1,000,000 | \$100,000,000 |

This is a common weighting scheme we see from the level of biologists- not as worried about the costs as the biological outcome.

Importance weights

- These reflect the **relative importance** of each criterion in a decision-making process and are used in SMART
- Example:

| | Weight | Translocations | Habitat Restoration |
|---------------------------|--------|----------------|---------------------|
| Maximize Pr (persistence) | 0.9 | 0.5 | 0.9 0.51 |
| Minimize cost | 0.1 | \$1,000,000 | \$100,000,000 |

But what if this is the new outcome? Should we update the weights?

Importance weights

- These reflect the **relative importance** of each criterion in a decision-making process and are used in SMART
- Example:

| | Weight | Translocations | Habitat Restoration |
|---------------------------|--------|----------------|---------------------|
| Maximize Pr (persistence) | 0.9 | 0 | 1 |
| Minimize cost | 0.1 | 1 | 0 |

How about now when we standardize outcomes?

We may want a new method to assign weights that considers the absolute range of the predicted values

Swing weighting

- Summing normalized scores (i.e., using SMART) with direct importance weights can be misleading.
- Swing weights consider the particular values available (range of actual alternatives).
 - Preferences are context specific, not abstract.
- Use the 'swing' or range from worst to best values across the alternatives.



Swing weighting – Buying a car example



Displays possible outcomes for each objective

| Objective | | | | Range | |
|-----------|-------------|-----------|------|--------|------|
| | Description | Attribute | Goal | Worst | Best |
| A | Life span | years | max | 6 | 12 |
| B | Price | \$(1,000) | min | 24 | 8 |
| C | Color | natural | max | yellow | red |

Swing weighting – Buying a car example



| Objective | | | | Range | | Hypothetical Alternatives (car) | | | |
|-----------|-------------|-----------|------|--------|------|---------------------------------|---|---|---|
| | Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 |
| A | Life span | years | max | 6 | 12 | 6 | | | |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | | | |
| C | Color | natural | max | yellow | red | Yellow | | | |

**Write down
worst-case
alternative**

Swing weighting – Buying a car example



| Objective | | | | Range | | Hypothetical Alternatives (car) | | | |
|-----------|-------------|-----------|------|--------|------|---------------------------------|--------|--------|-----|
| | Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 |
| A | Life span | years | max | 6 | 12 | 6 | 12 | 6 | 6 |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | 24 | 8 | 24 |
| C | Color | natural | max | yellow | red | Yellow | Yellow | Yellow | Red |

These alternatives have outcomes that are the worst for each objective except one

Swing weighting – Buying a car example



| Objective | | | | Range | | Hypothetical Alternatives (car) | | | |
|-----------|-------------|-------------------------|------|--------|------|---------------------------------|--------|--------|-----|
| | Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 |
| A | Life span | years | max | 6 | 12 | 6 | 12 | 6 | 6 |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | 24 | 8 | 24 |
| C | Color | natural | max | yellow | red | Yellow | Yellow | Yellow | Red |
| Rank | | (1 is best; 4 is worst) | | | | 4 | 2 | 1 | 3 |

Next, rank each of the 4 alternatives (including worst-case benchmark) from 1 to 4

Swing weighting – Buying a car example



| Objective | | Range | | | Hypothetical Alternatives (car) | | | | |
|-------------|-----------|---------------------------|-------|--------|---------------------------------|--------|--------|--------|-----|
| Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 | |
| A | Life span | years | max | 6 | 12 | 6 | 12 | 6 | 6 |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | 24 | 8 | 24 |
| C | Color | natural | max | yellow | red | Yellow | Yellow | Yellow | Red |
| Rank | | (1 is best; 4 is worst) | | | 4 | 2 | 1 | 3 | |
| Score | | (100 is best; 0 is worst) | | | 0 | 70 | 100 | 5 | |

Using the ranks, score the alternatives from 0 to 100
 (we rank then score for some cognitive help!)



Swing weighting – Buying a car example



| Objective | | Range | | | Hypothetical Alternatives (car) | | | | |
|-------------|-----------|---------------------------|-------|--------|---------------------------------|--------|--------|--------|-----|
| Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 | |
| A | Life span | years | max | 6 | 12 | 6 | 12 | 6 | 6 |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | 24 | 8 | 24 |
| C | Color | natural | max | yellow | red | Yellow | Yellow | Yellow | Red |
| | Rank | (1 is best; 4 is worst) | | | 4 | 2 | 1 | 3 | |
| | Score | (100 is best; 0 is worst) | | | 0 | 70 | 100 | 5 | |
| | Weight | score/(sum of scores) | | | 0 | 0.40 | 0.57 | 0.03 | |

Calculate your weights!



Swing weighting – Buying a car example



| Objective | | Range | | | Hypothetical Alternatives (car) | | | | |
|-------------|-----------|---------------------------|-------|--------|---------------------------------|--------|--------|--------|-----|
| Description | Attribute | Goal | Worst | Best | Bench mark | 1 | 2 | 3 | |
| A | Life span | years | max | 6 | 12 | 6 | 12 | 6 | 6 |
| B | Price | \$(1,000) | min | 24 | 8 | 24 | 24 | 8 | 24 |
| C | Color | natural | max | yellow | red | Yellow | Yellow | Yellow | Red |
| | Rank | (1 is best; 4 is worst) | | | 4 | 2 | 1 | 3 | |
| | Score | (100 is best; 0 is worst) | | | 0 | 70 | 100 | 5 | |
| | Weight | score/(sum of scores) | | | 0 | 0.40 | 0.57 | 0.03 | |

These are your weights for objective A,B,C!!!!



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Swing weighting activity

SEE EXAMPLE

EXCEL LINK

Skills Check

SEE SKILLS CHECK

EXCEL LINK

Activity: think about your decision problem

- For your final project presentation, you will provide a slide of your Tradeoffs
- Some hints:
 - Review your consequence table from last week (or make one now)
 - Do you have any irrelevant objectives? Dominated alternatives? Can you make even swaps?
 - Can you use smart or swing weighting to help make your decision?
- **Feel free to go back to your problem framing, objectives, alternatives, and consequences steps!**

Fill out course evaluation form

Looking ahead:



Next week: I step of PrOACTI



Weekly: Work through a step of the PrOACT process/
learn extra tools

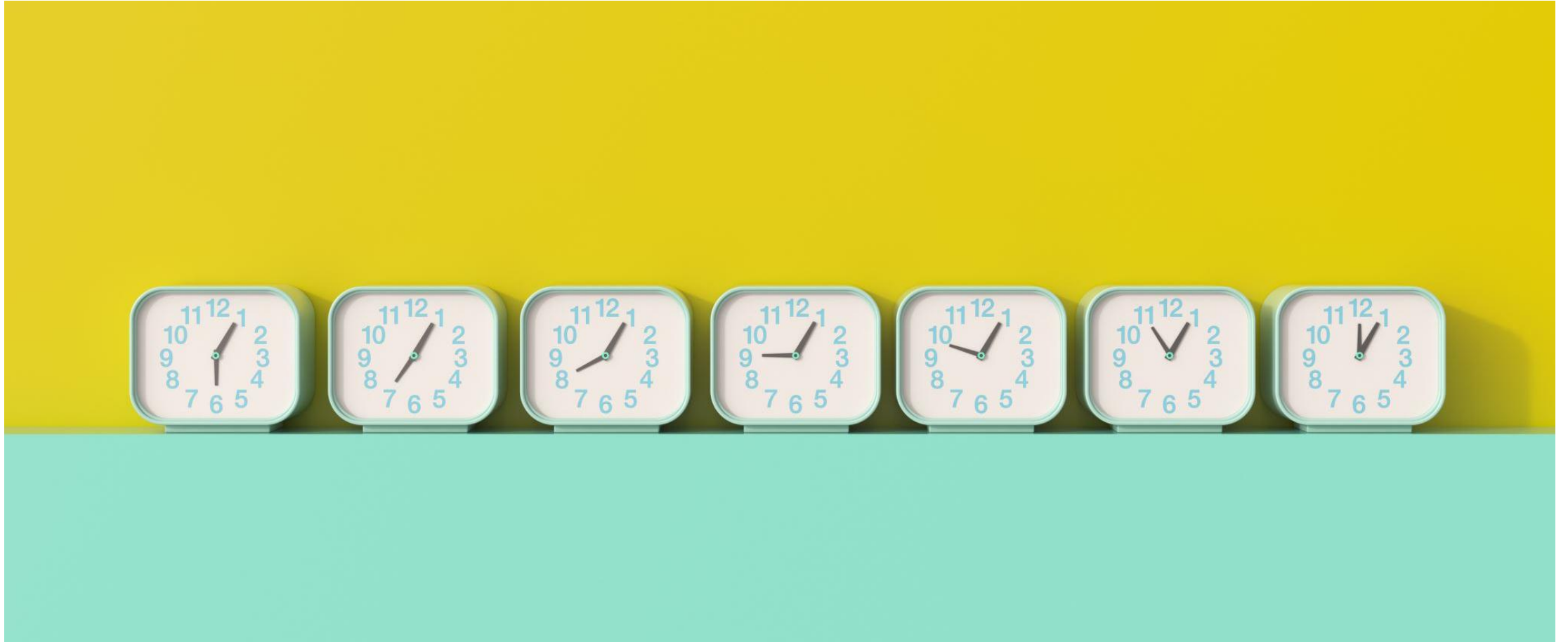


Last week of class:

Elevator pitch of your research project in
terms of SDM/PrOACT

Note: Abridged PrOACT story slides with a star on the upper right
are good examples to use for your presentation

Extra time activities:



Reading discussion: Runge et al. 2020 Chapter 5 (Converse)

- Why do you think multi-criteria decision analysis is useful?
- Compare the pros/cons of structured discussions over quantitative techniques to examine trade-offs
- What are some pitfalls of MCDA?
- What happens if we miss an objective?