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Utilization of optimization models in decision trees: the Contingent portfolio programming method

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Presentation outline

Problem description

Problem formulation

Solving the problem

Conclusions and questions + homework

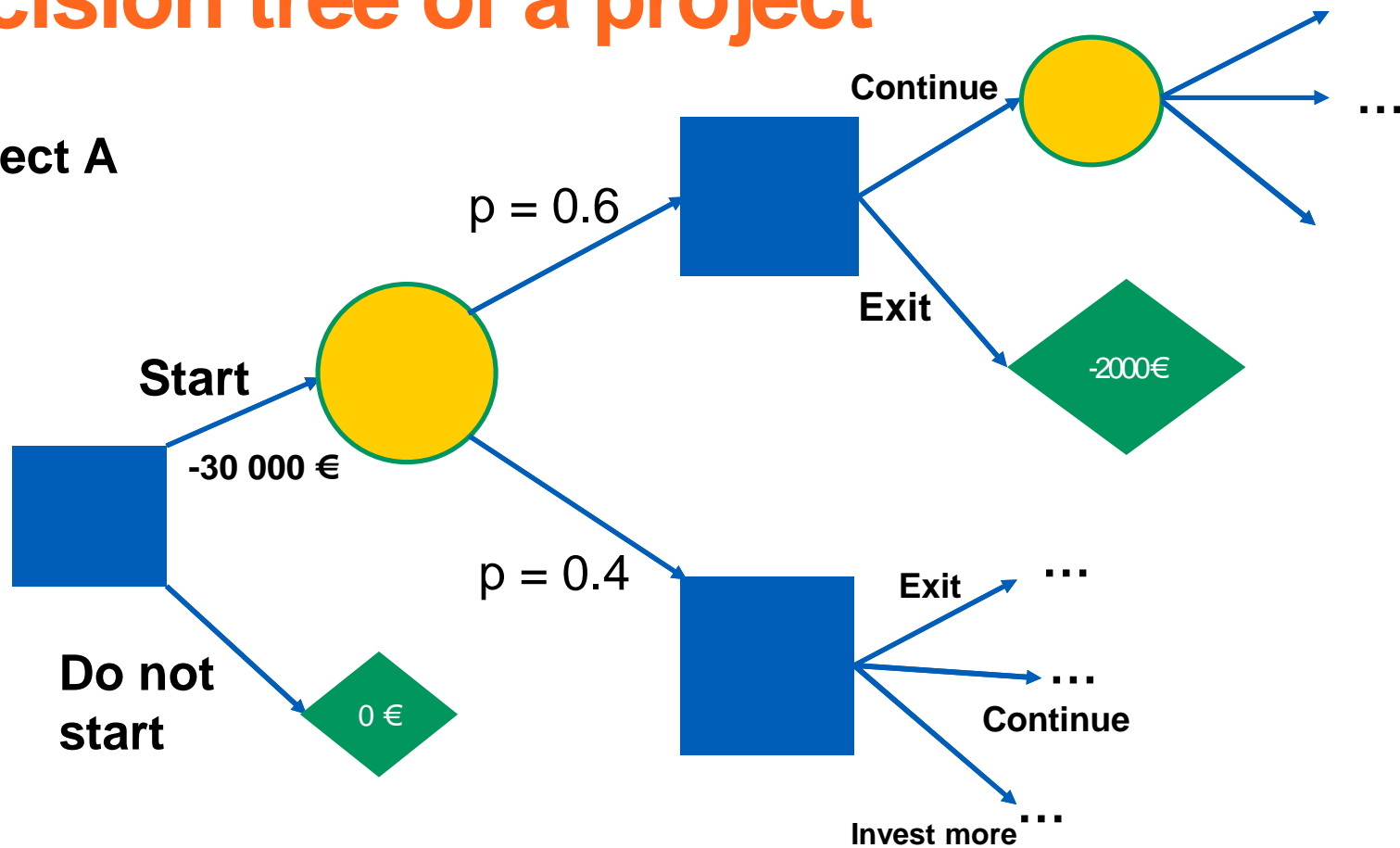
Problem description

Portfolio programming

- The decision maker has the possibility to launch multiple R&D projects
- The projects have multiple stages in which the decision maker can decide how the projects are continued
- The goal is to create a plan describing which projects are started and how they are continued under different scenarios
- The decision maker has a limited amount of resources that can be allocated to the projects

Decision tree of a project

Project A

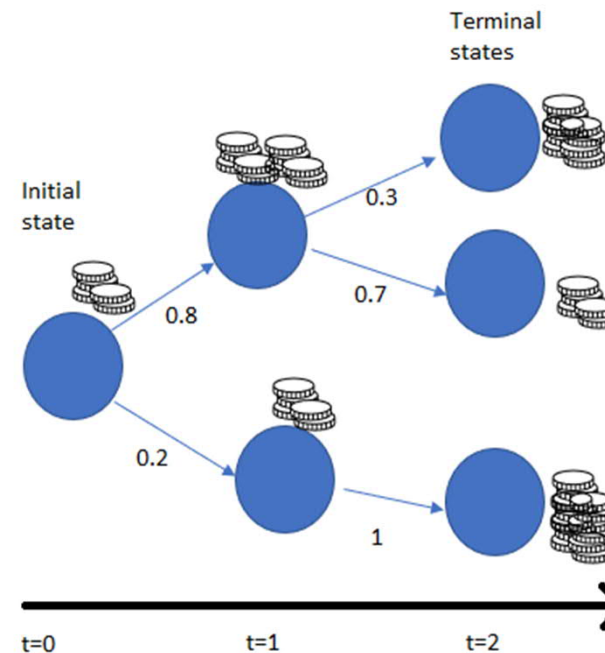


Differences between CPP and standard decision tree optimization

- There are multiple decision trees that cannot be solved individually
 - *Resource constraints apply to all projects*
 - *The chosen plan must be coherent with the decision maker's risk preferences*
 - The chance nodes are usually shared between the project trees
 - *Government sets travelling restrictions*
 - *Pandemic ends*
 - *Other economic shocks*
- ⇒ *In a chance node the state of the nature changes. A state tree can be drawn to visualize the probabilities of moving between these states.*

State tree

- Transitions between states are the only source of randomness
- Once a portfolio management strategy is fixed, the amount of resources at time t depends only on the state s_t
- The decision maker is interested in the probability distribution of resources at the end of the planning horizon





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Problem formulation

- *Variables*
- *Constraints*
- *Objective function*

Known information

- A state tree with probabilities
- Project trees with costs and payoffs
- Initial holdings of resources
- Other additional parameters (for example risk free interest rate)

Variables: Action variables

- For each possible choice a (binary) variable is introduced
 - Action variables X_i
- The action variables can be indexed using the project, state of the nature, and choices that are possible to make in the decision point

Variables: Surplus variables

- For each resource and state, there is a variable describing the amount of the resource
 - Surplus variables RS_s^r
- These variables are typically continuous and can be constrained to only attain nonnegative values

Variables: Deviation variables

- For each terminal state, there are two variables describing the difference of the outcome compared to a target
 - Deviation variables $\Delta V s_i^+$ and $\Delta V s_i^-$
- For each terminal state, either one of these variables is always zero depending on whether the outcome is better or worse than the target
- These variables are used later when the objective function is defined, and we will return to these later

Constraints: Consistency

- At the first decision points of each project exactly one alternative is chosen
 - $X_a + \dots + X_n = 1$
- Further choices are only planned if they can follow a choice made before
 - $X_a + \dots + X_n = X'$
- Sometimes allowing the sum to be more than one can be allowed (for example if an investment can be done multiple times)

Constraints: Resources

- The idea is to model the dependencies of resources between different state
- For example, if there is only one project which can be started for a cost of 100 euros and the initial amount of money is 500 euros, we have constraint $500 - 100X_{start} = RS_{s0}^{money}$
- If in the next state, the project can be continued for 200 euros and the risk-free interest rate is 1%, we have constraint $1.01RS_{s0}^{money} - 200X_{continue} = RS_{s1}^{money}$
- If loaning money is not allowed, $RS_{si}^{money} \geq 0$

Constraints: Deviation constraints

- For each terminal state, the deviation variables should describe the deviation from a target value t .
- For example, if money is the only interesting resource

$$RS_{terminal_i}^{money} - t + \Delta_{terminal_i}^- - \Delta_{terminal_i}^+ = 0$$

Objective function

- In the end of the planning horizon, the decision maker has some amount of resources
- The amount of resources is random
- The decision maker tries to maximize the certainty equivalent of the resources
- The value in a terminal state s is additive and linear with respect to the resource standings, $V_s = \sum w_s^r RS_s^R$

Objective function

- The certainty equivalent can be approximated in many ways
- The authors suggest using lower semi-absolute deviation (LSAD) or expected downside risk (EDR) which describe the expected shortfalling from the plans expected outcome (LSAD) or from a fixed value t (EDR).
- Using EDR, the objective function is $CE = EV - \lambda * EDR$
- In this function, parameters λ and t allow to include the risk preference of the decision maker to some extent
- The expected value EV can be expressed using the surplus variables while the EDR/LSAD can be written with help of the negative deviation variables ΔV_i^-

Recap: Problem formulation

- **Constraints**
 - Consistency
 - Resources
 - Deviation constraints
 - (Optional constraints)
- **Objective function**
 - Maximize expected utility
 - The authors state that reasonable risk aversion can be modeled using EDR/LSAD without turning the problem into nonlinear optimization

Solving the problem

Solving the problem

- If the constraints and the objective function are chosen as suggested, the problem falls to mixed integer programming and can be solved using standard linear programming solvers
- Solving the problem can become complicated if there are many project-specific risks. In this case, the state tree can become too big.

Reference

This presentation is based on the following article:

Gustafsson, J., Salo, A. (2005). Contingent portfolio programming for the management of risky projects. *Operations Research* 53: 946-956.



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**Thank you for
listening!**

Homework problem

In the related Excel template, a problem related to planning with two projects is presented.

- 1) Fill in the missing consistency constraints
 - 2) Fill in the missing resource surplus constraints
 - 3) Fill in the missing deviation constraints
 - 4) Formulate the objective function. The formula for EDR is $\sum_{x:x < t} (t - x)p(x)$.
 - 5) Solve the optimal plan
 - 6) Remember to return your solution (alvar.kallio@aalto.fi)
- If anything is unclear, feel free to contact
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