

# Project Scheduling with Alternative Technologies and Stochastic Activity Durations

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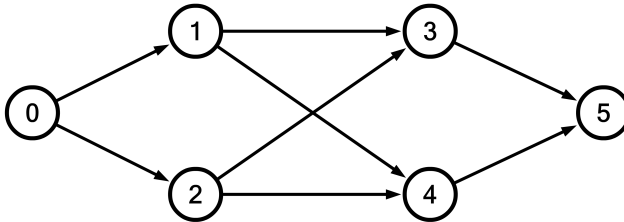
# Introduction: Module Networks

Our goal is to maximize the NPV of projects in which:

- activities can fail,
  - activities that pursue the same result may be grouped in “modules”,
  - each module needs to be successful for the project to succeed,
  - a module is successful if at least one of its activities succeeds
- ⇒ not all activities in the network have to be started in order for the project to be successful,
- ⇒ upon failure of all activities in the module, the module fails, resulting in overall project failure.

This is common in R&D (especially in NPD) but also in other sectors: pharmaceuticals, software development, fundraising ...

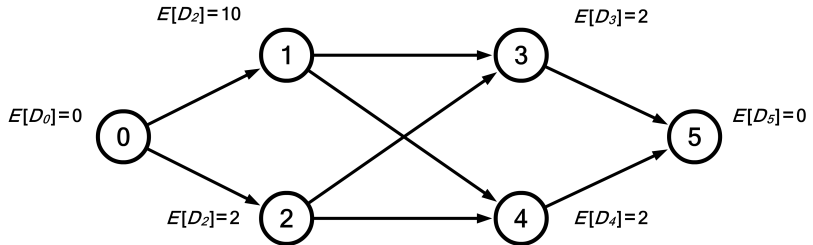
## Example: Definitions



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- (AON) project network with  $n$  activities

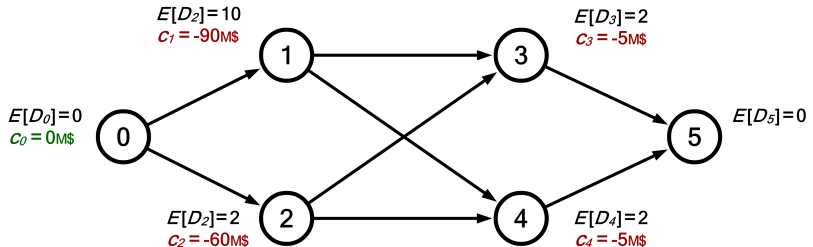
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- (AON) project network with  $n$  activities
- Stochastic activity durations: expected duration  $E[D_j]$  of activity  $j$

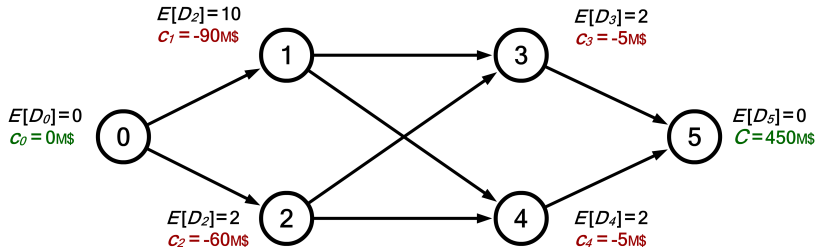


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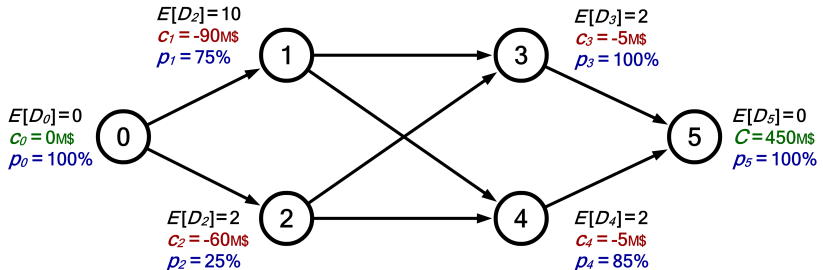
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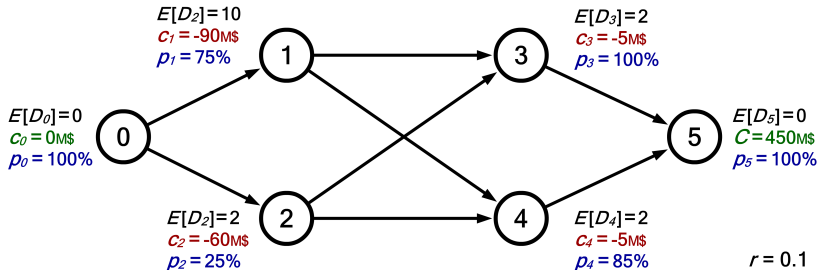
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- End-of-project Payoff  $C$  obtained upon overall project success

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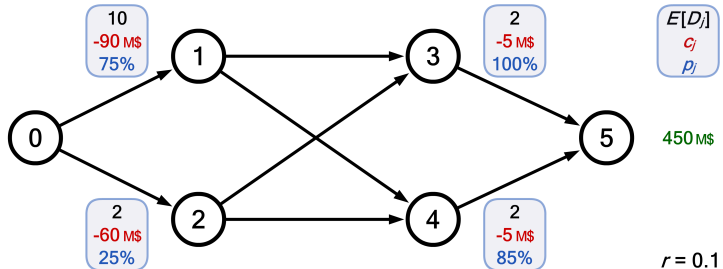
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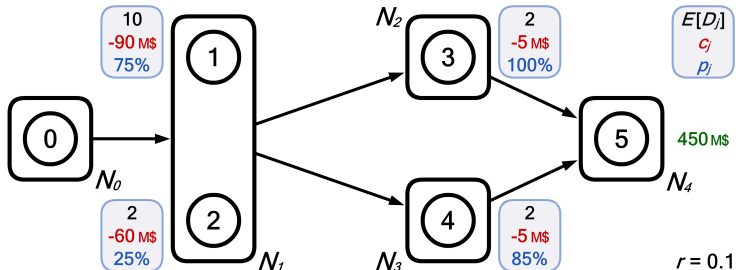
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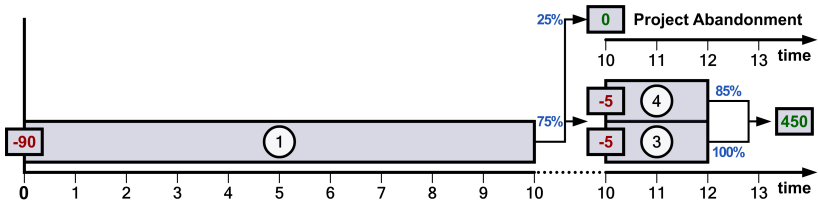


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- Time value of money  $\Rightarrow$  discount rate  $r$
- $m$  modules  $N_i$

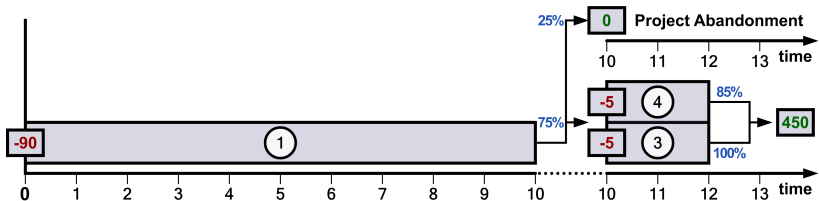
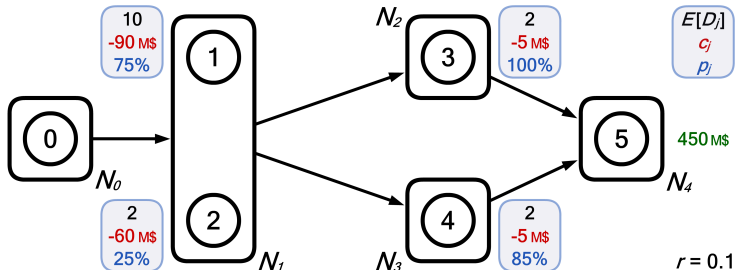
## Example: Policy $\Pi_1$

A solution is not a schedule but rather a scheduling policy (even with deterministic durations)

Policy  $\Pi_1$  results in a NPV of **-6.35M\$** if activity durations are deterministic

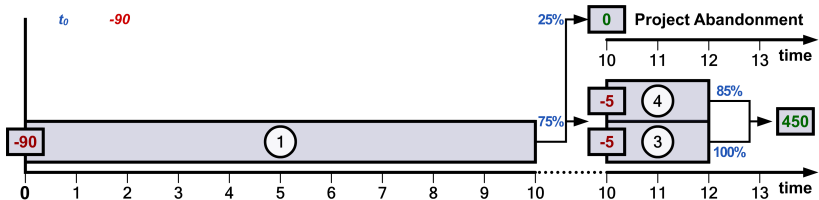
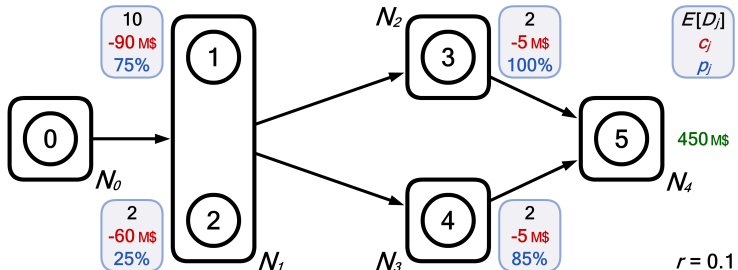


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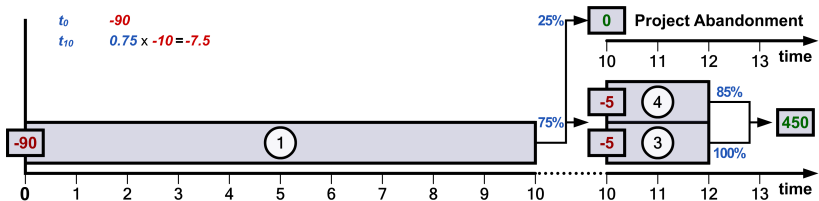
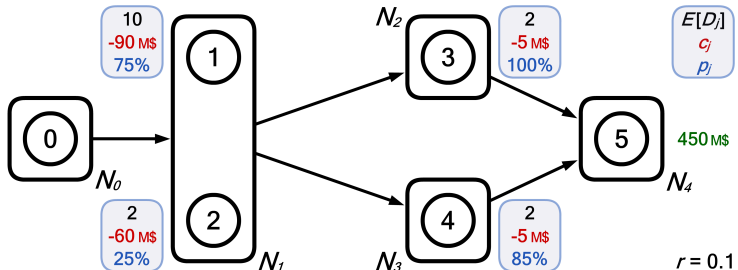




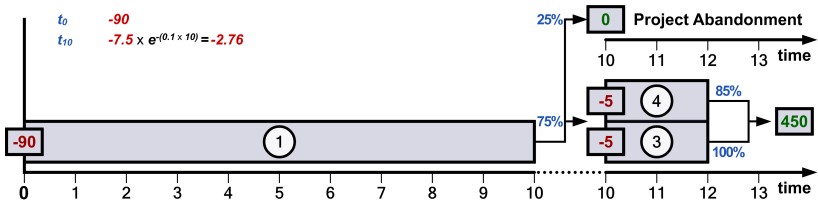
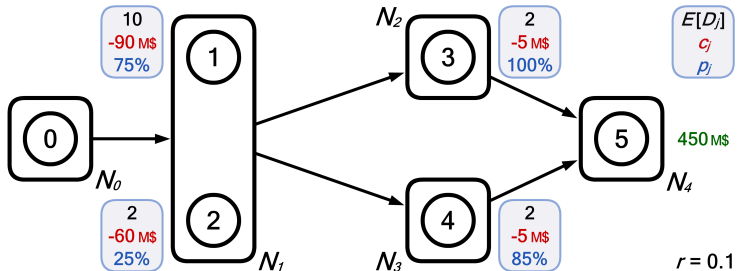
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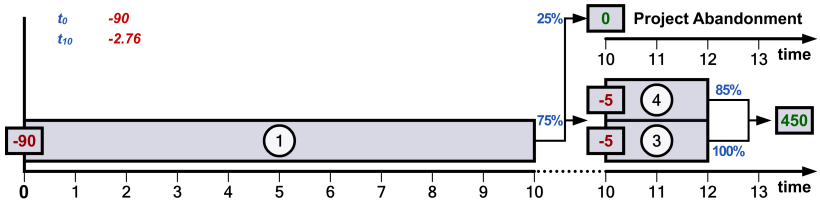
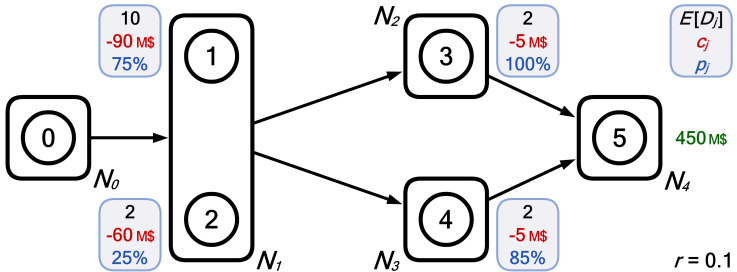
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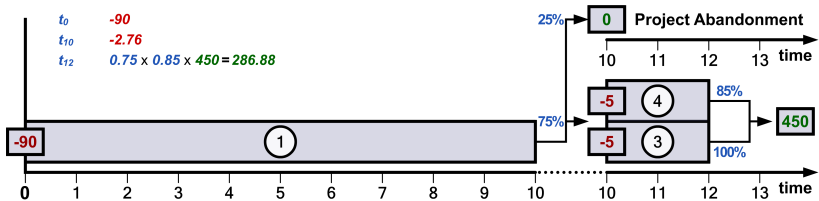
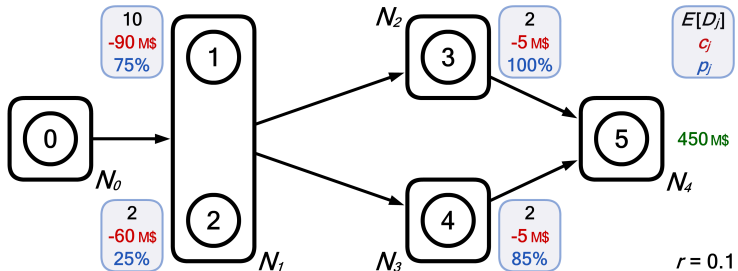
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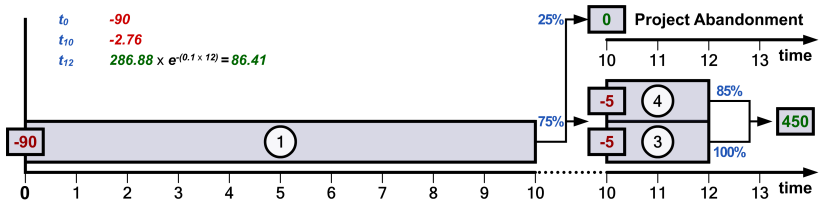
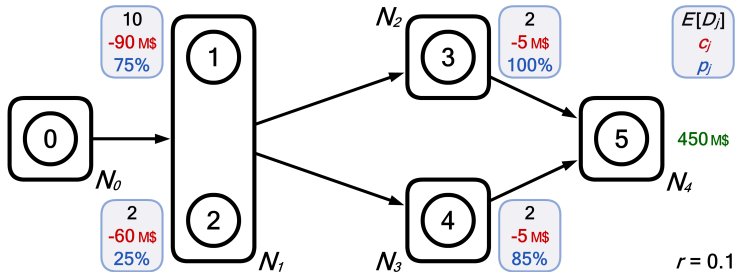
Example: Policy  $\Pi_1$



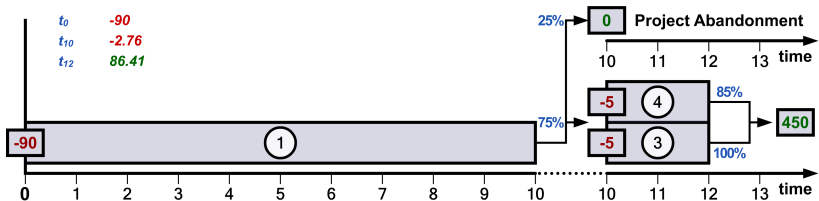
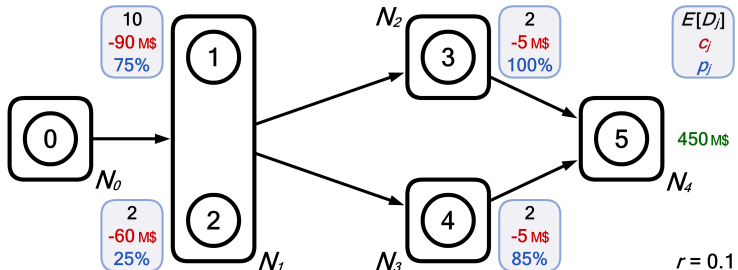
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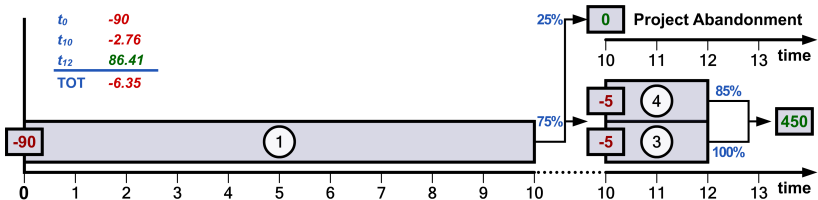
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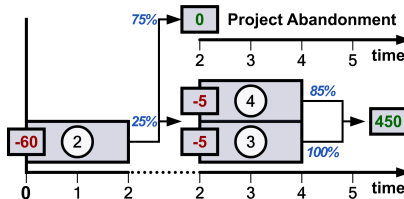
## Example: Policy $\Pi_2$

A solution is not a schedule but rather a scheduling policy (even with deterministic durations)

Policy  $\Pi_1$  results in a NPV of **-6.35M\$** if activity durations are deterministic

Policy  $\Pi_2$  is optimal for deterministic durations and yields a NPV of **2.05M\$**

$t_0$	-60
$t_2$	-2.04
$t_4$	64.10
TOT	2.05



# Backward SDP-recursion: concepts & definitions

Exponentially distributed activity durations  $\Rightarrow$  use of a Continuous-Time Markov Chain (CTMC) to model the statespace.

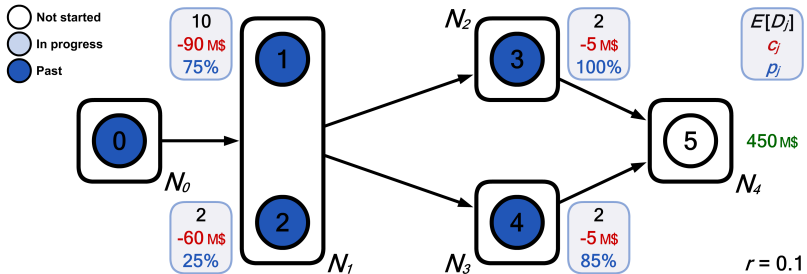
The state of an activity  $j$  at time  $t$  can be:

- $\Omega_i(t) = 0$ : not started,
- $\Omega_i(t) = 1$ : in progress,
- $\Omega_i(t) = 2$ : past (successfully finished, failed or considered redundant because its module is completed).

The state of the system at a time instance  $t$  is given by vector  $\Omega(t) = \{\Omega_0(t), \dots, \Omega_n(t)\}$ .

The size of the statespace has upper bound  $3^n$ . Most states do not satisfy precedence constraints  $\Rightarrow$  a strict definition of the statespace is required and provided in Creemers et al. (2008).

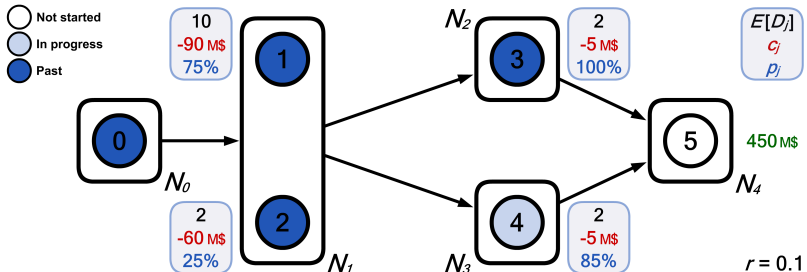
## Example: Stochastic Durations



(2,2,2,2,2,0) [450M\$]

Project value upon entry of the final state = project payoff

# Example: Stochastic Durations



(2,2,2,2,2,0) [450M\$]

↳ (2,2,2,2,1,0) [318.75M\$]

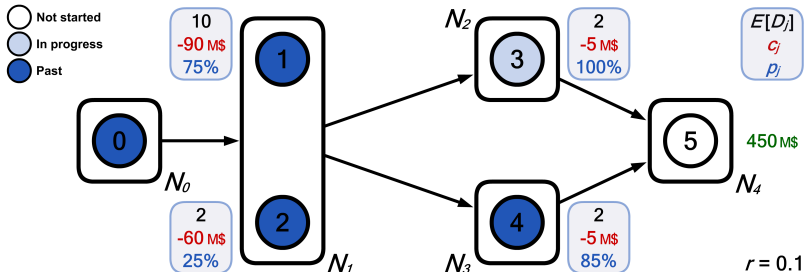
Discount factor:  $(1/D_j) \times (r + (1/D_j))^{-1}$

$D_4 = 2 \Rightarrow$  discount factor = 0.83

Discounted value upon state entry = 375

$p_4 = 0.85 \Rightarrow$  NPV upon state entry = 318.75

# Example: Stochastic Durations



(2,2,2,2,2,0) [450M\$]

└─ (2,2,2,2,1,0) [318.75M\$]  
 └─ (2,2,2,1,2,0) [375M\$]

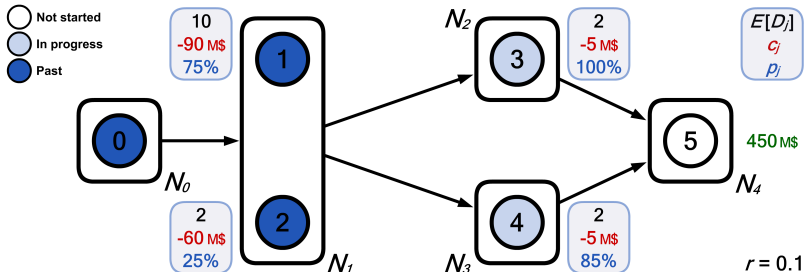
Discount factor:  $(1/D_j) \times (r + (1/D_j))^{-1}$

$D_3 = 2 \Rightarrow$  discount factor = 0.83

Discounted value upon state entry = 375

$p_3 = 1.00 \Rightarrow$  NPV upon state entry = 375

# Example: Stochastic Durations



(2,2,2,2,2,0) [450M\$]  
 ↳ (2,2,2,2,1,0) [318.75M\$]  
 ↳ (2,2,2,1,2,0) [375M\$]  
 ↳ (2,2,2,1,1,0) [289.77M\$]

Discount factor = 0.91

Probability of finishing activity  $j$  first :  $(1/D_j) \times (\text{SUM}(1/D_j))^{-1}$

=> Probability 3 finishes first = 50% &  $p_3 = 100\%$

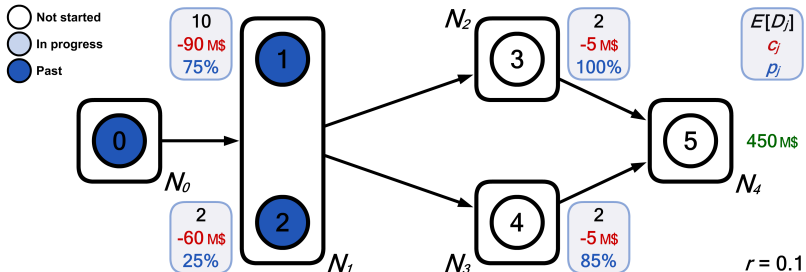
$0.5 \times 0.91 \times 1.00 \times 318.75 = 144.89$

=> Probability 4 finishes first = 50% &  $p_4 = 0.85\%$

$0.5 \times 0.91 \times 0.85 \times 375 = 144.89$

=> NPV upon state entry = 289.77

# Example: Stochastic Durations



(2,2,2,2,2,0) [450M\$]

→ (2,2,2,2,1,0) [318.75M\$]

→ (2,2,2,1,2,0) [375M\$]

→ (2,2,2,1,1,0) [289.77M\$]

→ (2,2,2,0,0,0) [279.77M\$]

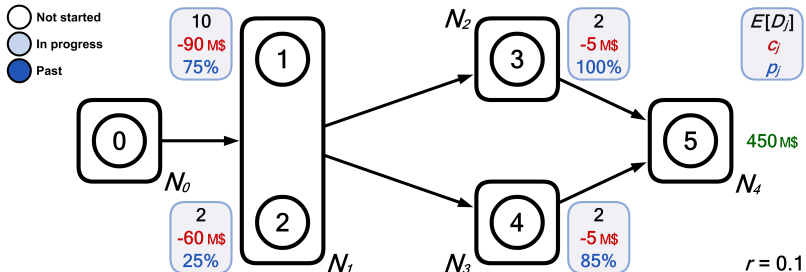
3 possible decisions (pick the optimal one):

- Start activity 3 => incur cost  $c_3 = -5M\$$   
 => end up in (2,2,1,0,0)

- Start activity 4 => incur cost  $c_4 = -5M\$$   
 => end up in (2,2,0,1,0)

- Start activity 3 & 4 => incur cost  $c_3 + c_4 = -10M\$$   
 => end up in (2,2,1,1,0) [289.77M\$]

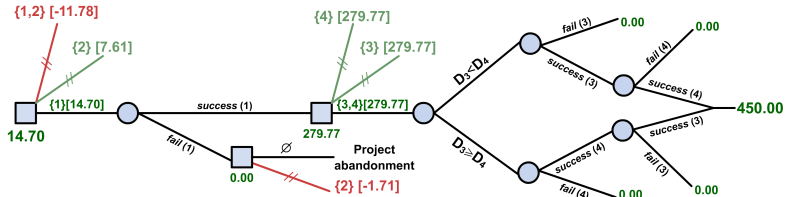
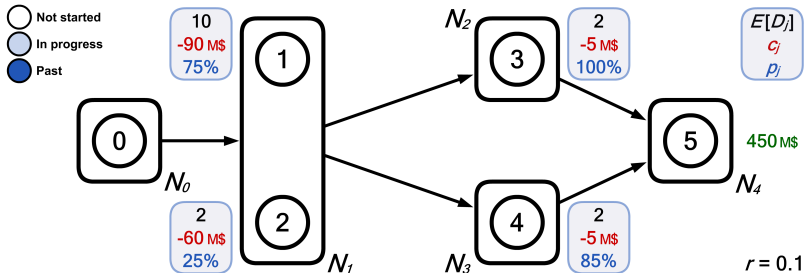
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(2,2,2,2,2,0) [450M\$]  
 ↳ (2,2,2,2,1,0) [318.75M\$]  
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 ↳ (2,2,2,1,1,0) [289.77M\$]  
 ↳ (2,2,2,0,0,0) [279.77M\$]  
 ↳ (...)  
 ↳ (0,0,0,0,0,0) [14.70M\$]



# Example: Stochastic Durations



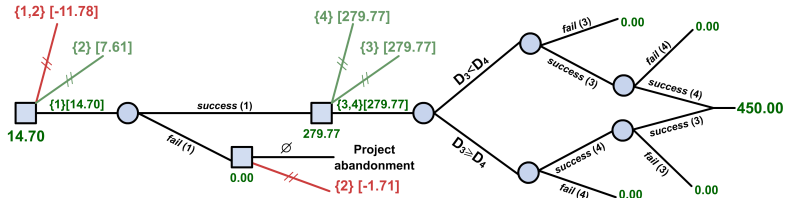
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**A solution is not a schedule but rather a scheduling policy (even with deterministic durations)**

**Policy  $\Pi_1$  results in a NPV of -6.35M\$ if activity durations are deterministic**

Policy  $\Pi_2$  is optimal for deterministic durations and yields a NPV of 2.05m\$

For stochastic durations, policy  $\Pi_1$  is optimal with a NPV of 14.70m\$



# Results & Future Research

## Computational results:

- 100 project networks were generated varying in size from 75 activities up to 120 activities. Out of these project networks, 75 have been solved to optimality.
- Computation times vary from less than a second to a maximum of 81,593 seconds. The average computation time for those networks solved amounts to 4,808 seconds.
- The main determinant of the computation time is the density of the network.

## Future research:

- Using the model to generate insights in the use of modules
- General activity durations using Phase-Type distributions
- Resources

# Time for questions

