

# Exact and heuristic methods for trading-off makespan and stability in stochastic project scheduling

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Project scheduling literature: mostly RCPSP

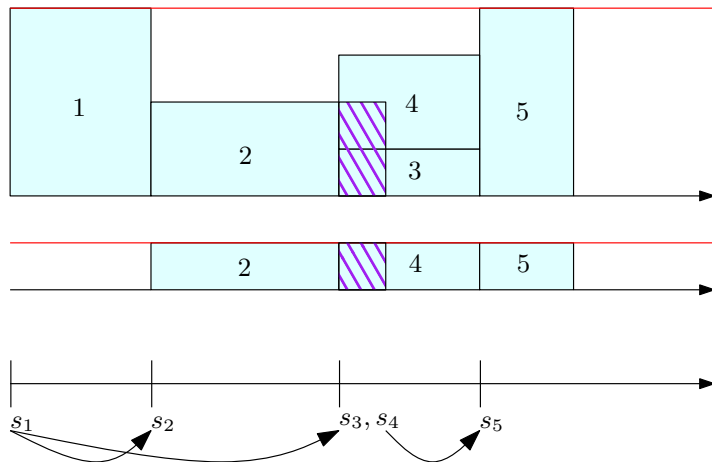
- activities, resources, precedence and resource constraints
- durations = single-point estimates
- NP-Hard (Blazewicz et al. 1983)

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How useful for real-world projects?

## Example RCPSP & solution



## **Reactive** stochastic project scheduling: S-RCPSp

- stochastic durations  $\mathbf{D} = (D_1, \dots, D_n)$  with known  $\mathbb{P}[D_i = t]$
- solution = ~~fixed schedule~~ scheduling policy  $\Pi$
- find  $\Pi$  that minimizes  $\mathbb{E}[\max_{i=1, \dots, n} (S_i(\Pi, \mathbf{D}) + D_i)]$
- RCPSp generalization (at least as hard)

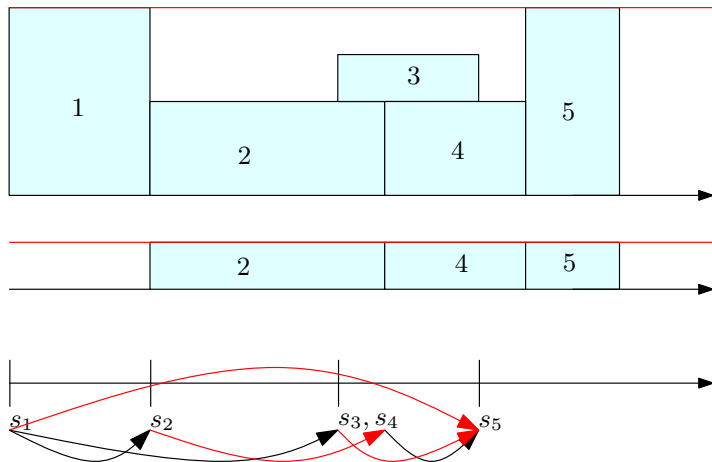
## **Reactive** stochastic project scheduling: S-RCPSP

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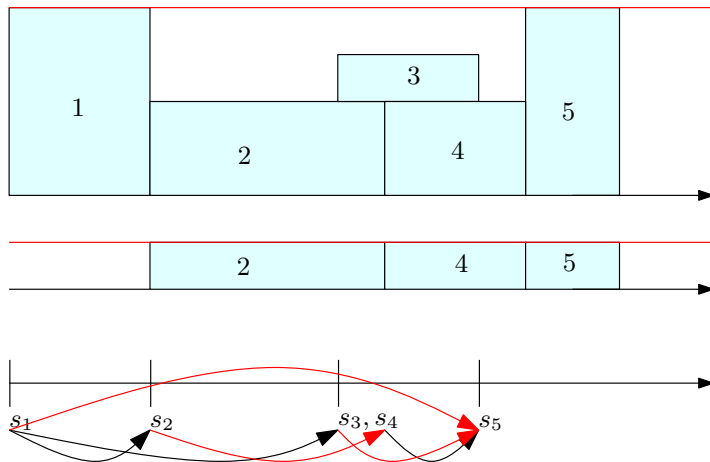
## Various classes of $\Pi$

- list-based policies, earliest-start policies, etc. (Möhring et al. 1984, 1985)
- exact procedures (Stork 2000)
- meta-heuristics (e.g. Ballestín 2007, Ashtiani et al. (2011))

## Example S-RCPSP & solution



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Disadvantage: no fixed-time schedule at all



## Proactive-reactive stochastic project scheduling

- stochastic durations  $D = (D_1, \dots, D_n)$  with known  $\mathbb{P}[D_i = t]$
- solution = (proactive schedule  $\mathbf{t}$ , reactive policy  $\Pi$ )
  - $\mathbf{t} = (t_1, \dots, t_n)$ : buffered and can more-or-less be trusted
  - $\Pi$ : what to do in case of buffer overruns
- **railway mode**:  $S_i(\Pi, \mathbf{t}) \geq t_i$
- find  $(\mathbf{t}, \Pi)$  that balances *expected instability* and *expected makespan*

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Minimize both

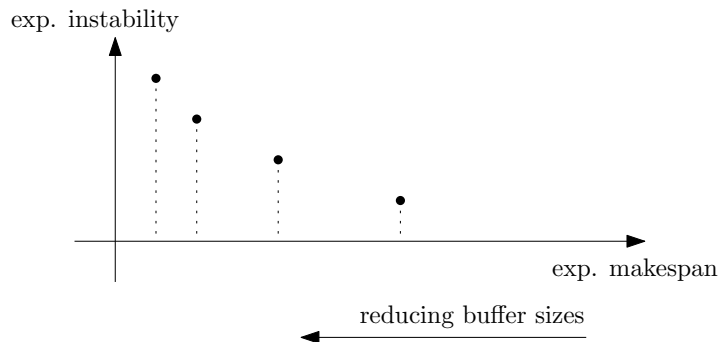
- 1 expected instability

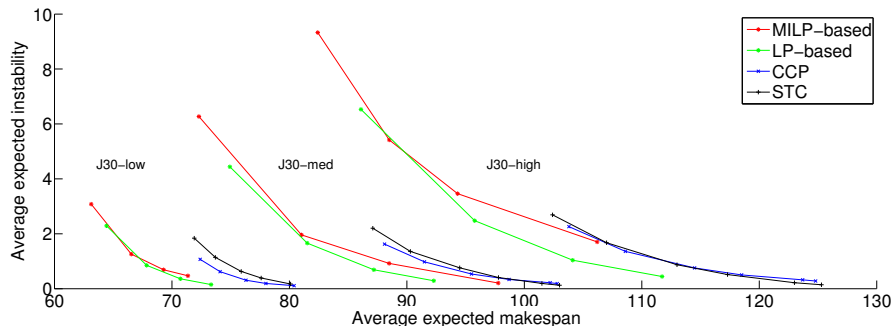
$$\mathbb{E}\left[\sum_i (S_i((\Pi, \mathbf{t}), \mathbf{D}) - t_i)\right]$$

- 2 expected makespan

$$\mathbb{E}\left[\max_i (S_i((\Pi, \mathbf{t}), \mathbf{D}) + D_i)\right]$$

Tuning some tradeoff parameter

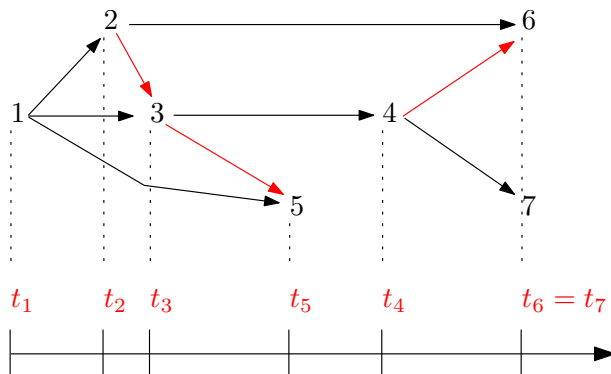




- CCP model (Lamas and Demeulemeester, Journal of Scheduling, 2015)
- STC heuristic (Van de Vonder et al., EJOR, 2008)
- MILP-based heuristic ( $\mathcal{O}(2^m)$  with  $m < n$ )
- LP-based heuristic ( $\mathcal{O}(n^4)$ )

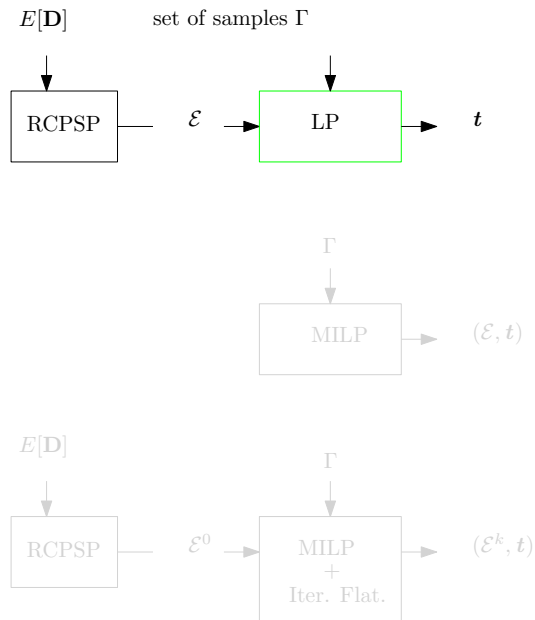
Define the Proactive Stochastic (PS-)RCPSP

- focus specifically on earliest-start (es-)policies
- find  $(\mathcal{E}, t)$  together as a pair
- to minimize  $\alpha \cdot \text{Exp.Makespan}(\mathcal{E}, t) + (1 - \alpha) \text{Exp.Instability}(\mathcal{E}, t)$

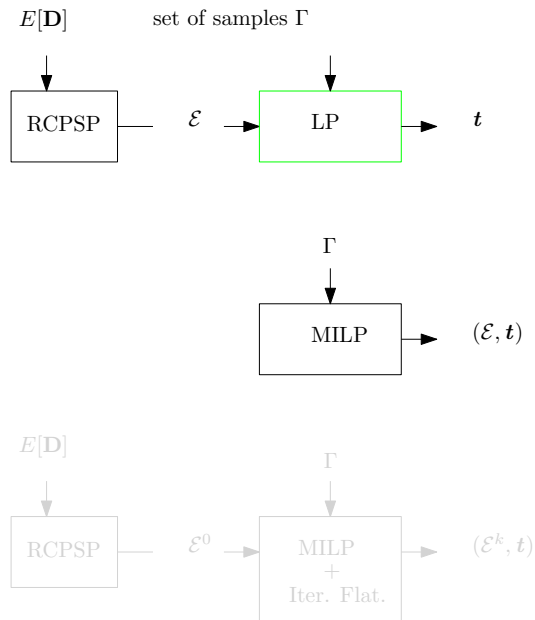


Stochastic optimization problem

# OUR APPROACH: SOLVING PS-RCPSP



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