

Temporal Scheduling of Projects with Time-Overlap Trade-Offs

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Outline

- 1 Problem definition
 - Concurrent engineering projects
 - Temporal constraints
 - Temporal scheduling problems
- 2 Structural issues
- 3 Temporal scheduling methods
 - Earliest completion times
 - Latest completion times
- 4 Performance analysis
- 5 Conclusions

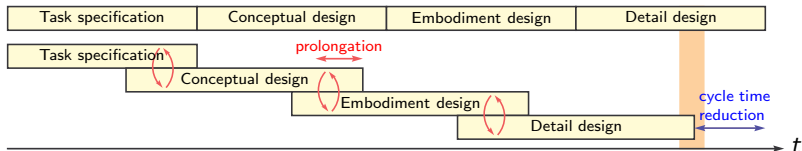
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Concurrent engineering projects

Concurrent engineering approach

- Industrial **development projects** organized in consecutive phases
- In high-tech sectors ability to place new products within **tight market entry time windows** constitutes decisive success factor
- **Concurrent engineering** approach: parallelize consecutive development phases to shorten cycle time of development project
- **Additional integration and coordination efforts** due to feedback loops between phases: trade-off between overlappings and durations (**time-overlap trade-off**)



Concurrent engineering projects

Overlap times and activity durations

- Development project consists of n activities $i \in V$ (phases, working packages, milestones, project beginning, project end)
- Precedence relationships $(i, j) \in E$ between activities, maximum project duration \bar{d}
- Overlapping of activities i, j with $(i, j) \in E$ during time

$$l_{ij} = C_i - S_j$$

leads to increasing duration of activity j

$$p_j = p_j(l_j) \quad \text{with } l_j = (l_{ij})_{(i,j) \in E}$$

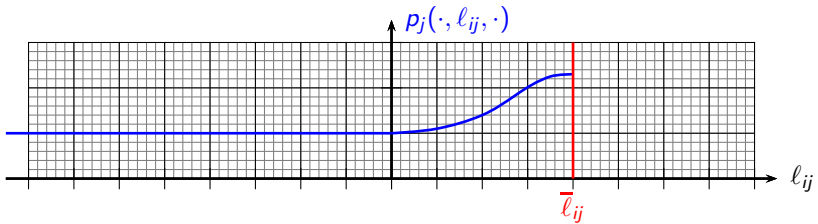
- Overlap times l_{ij} bounded by \bar{l}_{ij}

Concurrent engineering projects

Properties of duration functions $p_j(l_j)$

- p_j componentwise differentiable
- p_j componentwise constant when overlapping is avoided, p_j componentwise nondecreasing when overlapping is realized

$$\frac{\partial p_j}{\partial l_{ij}}(l_{ij}) = 0 \text{ for } l_{ij} < 0, \quad \frac{\partial p_j}{\partial l_{ij}}(l_{ij}) \geq 0 \text{ for } l_{ij} \in [0, \bar{l}_{ij}]$$

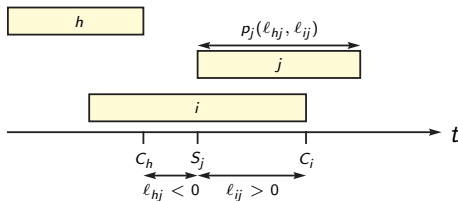


Temporal constraints

Maximum start-to-end time lags

- Negative overlap time ℓ_{ij} means that j is started $-\ell_{ij}$ time units after completion of i
- Maximum overlap time $\bar{\ell}_{ij}$ induces **maximum start-to-end time lag** between activity j and activity i

$$\ell_{ij} = C_i - S_j \leq \bar{\ell}_{ij} \quad \Leftrightarrow \quad C_i \leq S_j + \bar{\ell}_{ij}$$



Temporal constraints

Semantic power: How to model ...

- **project deadline**: maximum start-to-end time lag between project beginning $j = 0$ and project end $i = n + 1$

$$C_{n+1} \leq S_0 + \bar{d} \quad \Leftrightarrow \quad \bar{\ell}_{(n+1)0} = \bar{d}$$

- **ordinary precedence constraint** between i and j

$$S_j \geq C_i \quad \Leftrightarrow \quad \bar{\ell}_{ij} = 0$$

- **minimum end-to-start time lag** $d_{ij}^{min} > 0$ between i and j

$$S_j \geq C_i + d_{ij}^{min} \quad \Leftrightarrow \quad \bar{\ell}_{ij} = -d_{ij}^{min}$$

Semantic limitations

- Due to overlap-dependent activity durations only modeling of maximum start-to-end and minimum end-to-start relationships

Temporal scheduling problems

Earliest and latest start and completion times

- Determine earliest and latest start and completion times ES_h, LS_h, EC_h, LC_h of activities $h \in V$
- Earliest/latest start time problem for activity h

$$(TSP_h^S) \left\{ \begin{array}{l} \text{Min./Max. } S_h \\ \text{subject to } \begin{array}{ll} l_{ij} = S_i + p_i(l_i) - S_j & ((i, j) \in E) \\ l_{ij} \leq \bar{l}_{ij} & ((i, j) \in E) \\ S_0 = 0, S_j \geq 0 & (j \in V) \end{array} \end{array} \right\} S_T$$

- Earliest/latest completion time problem for activity h

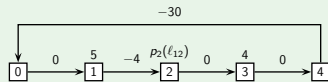
$$(TSP_h^C) \left\{ \begin{array}{l} \text{Min./Max. } C_h \\ \text{subject to } \begin{array}{ll} l_{ij} = C_i - [C_j - p_j(l_j)] & ((i, j) \in E) \\ l_{ij} \leq \bar{l}_{ij} & ((i, j) \in E) \\ C_0 = 0, C_j \geq p_j(l_j) & (j \in V) \end{array} \end{array} \right\} C_T$$

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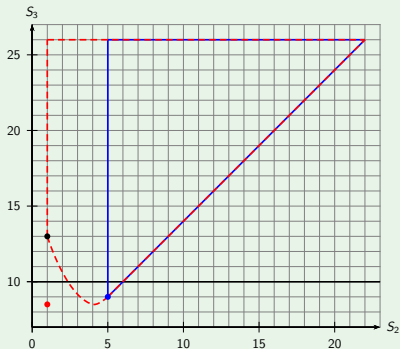
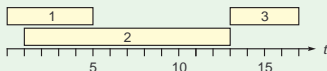
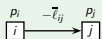
Example 1

Earliest start schedule ES is not feasible



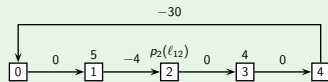
$$p_2(\ell_{12}) = 0.5(\ell_{12}^+)^2 + 4$$

Legend



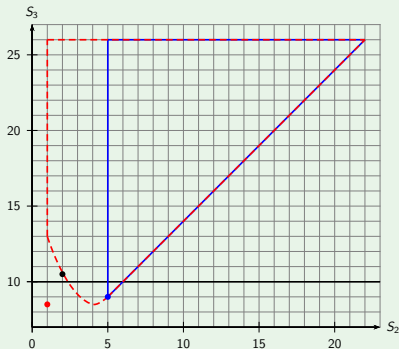
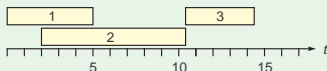
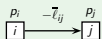
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Earliest start schedule ES is not feasible



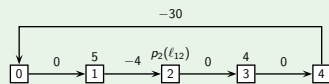
$$p_2(\ell_{12}) = 0.5(\ell_{12}^+)^2 + 4$$

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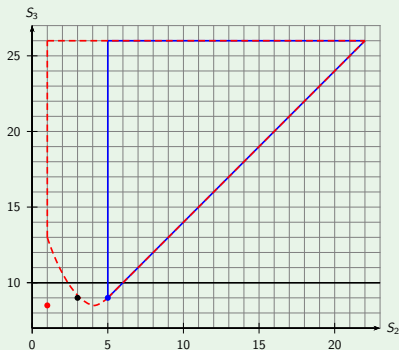
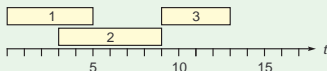
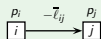
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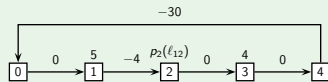
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Legend



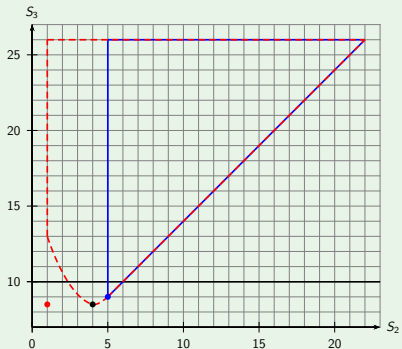
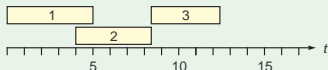
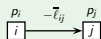
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Earliest start schedule ES is not feasible



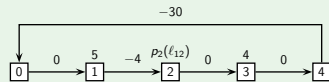
$$p_2(\ell_{12}) = 0.5(\ell_{12}^+)^2 + 4$$

Legend



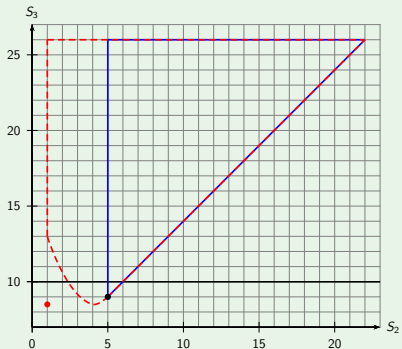
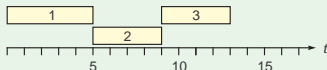
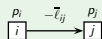
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Earliest start schedule ES is not feasible



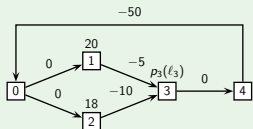
$$p_2(\ell_{12}) = 0.5(\ell_{12}^+)^2 + 4$$

Legend



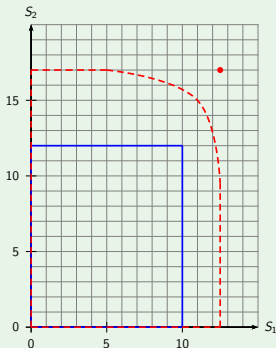
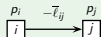
Example 2

Latest start schedule LS is not feasible



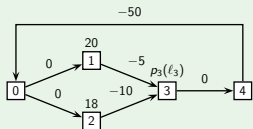
$$p_3(\ell_{13}, \ell_{23}) = 0.01(\ell_{13}^+)^2 + 0.05(\ell_{23}^+)^2 + 20$$

Legend



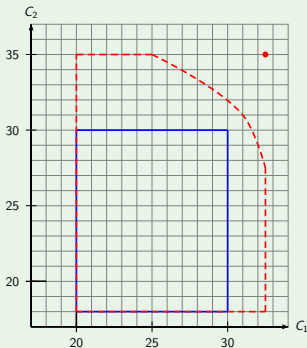
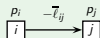
Example 2

Latest completion schedule LC is not feasible



$$p_3(\ell_{13}, \ell_{23}) = 0.01(\ell_{13}^+)^2 + 0.05(\ell_{23}^+)^2 + 20$$

Legend



Feasibility of earliest completion schedule

Proposition

- 1 The earliest completion schedule $EC = (EC_j)_{j \in V}$ is feasible.
- 2 Let $\ell = \ell(EC)$ be the minimal vector of overlap times belonging to schedule EC . For each $(i, j) \in E$ it holds that

$$\ell_{ij} = \min\{EC_i, \min_{(h,j) \in E} (\bar{\ell}_{hj} + EC_i - EC_h)\} \quad (1)$$

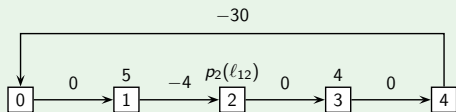
or ℓ_{ij} satisfies the following two optimality conditions:

$$\frac{d}{d\ell_{ij}} p_j((\ell_{ij} + EC_h - EC_i)_{(h,j) \in E}) = 1 \quad (2)$$

$$\frac{d^2}{d\ell_{ij}^2} p_j((\ell_{ij} + EC_h - EC_i)_{(h,j) \in E}) \geq 0 \quad (3)$$

Computation of optimal overlap times

Example 1 (cont'd)

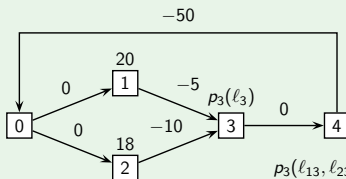


$$p_2(\ell_{12}) = 0.5(\ell_{12}^+)^2 + 4$$

- Equation (1): $\ell_{12} = \min\{EC_1, \bar{\ell}_{12}\} = \min\{5, 4\} = 4$
- Equation (2): $\frac{d}{d\ell_{12}} p_2(\ell_{12}) = \ell_{12} = 1$
- Equation (3): $\frac{d^2}{d\ell_{12}^2} p_2(\ell_{12}) = 1 > 0$
- $\ell_{12} = 4$: $p_2(\ell_{12}) = 12$, $C_2 = EC_1 - \ell_{12} + p_2(\ell_{12}) = 5 - 4 + 12 = 13$
- $\ell_{12} = 1$: $p_2(\ell_{12}) = 4.5$, $C_2 = EC_1 - \ell_{12} + p_2(\ell_{12}) = 5 - 1 + 4.5 = 8.5$
 $\Rightarrow EC_2 = 8.5$

Computation of optimal overlap times

Example 2 (cont'd)



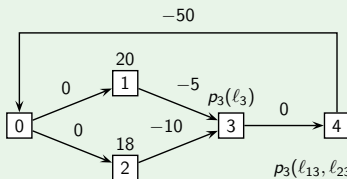
$$p_3(\ell_{13}, \ell_{23}) = 0.01(\ell_{13}^+)^2 + 0.05(\ell_{23}^+)^2 + 20$$

- Equation (1):

$$\ell_{13} = \min\{EC_1, \bar{\ell}_{13}, \bar{\ell}_{23} + EC_1 - EC_2\} = \min\{20, 5, 10 + 20 - 18\} = 5$$

Computation of optimal overlap times

Example 2 (cont'd)



$$p_3(\ell_{13}, \ell_{23}) = 0.01(\ell_{13}^+) ^2 + 0.05(\ell_{23}^+) ^2 + 20$$

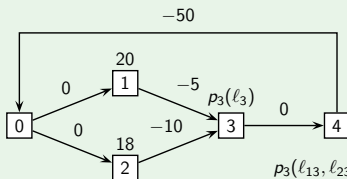
- Equation (2):

$$\begin{aligned} p_3(\ell_{13}) &= 0.01\ell_{13}^2 + 0.05(\ell_{13} + EC_2 - EC_1)^2 + 20 \\ &= 0.06\ell_{13}^2 - 0.2\ell_{13} + 20.2 \end{aligned}$$

$$\frac{d}{d\ell_{13}} p_3(\ell_{13}) = 0.12\ell_{13} - 0.2 = 1 \quad \Leftrightarrow \quad \ell_{13} = 10$$

Computation of optimal overlap times

Example 2 (cont'd)



$$p_3(\ell_{13}, \ell_{23}) = 0.01(\ell_{13}^+)^2 + 0.05(\ell_{23}^+)^2 + 20$$

- Equation (3): $\frac{d^2}{d\ell_{13}} p_3(\ell_{13}) = 0.12 > 0$
- $\ell_{13} = 5$: $p_3(\ell_{13}) = 20.7$, $C_3 = EC_1 - \ell_{13} + p_3(\ell_{13}) = 20 - 5 + 20.7 = 35.7$
- $\ell_{13} = 10$: $p_3(\ell_{13}) = 24.2$, $C_3 = EC_1 - \ell_{13} + p_3(\ell_{13}) = 20 - 10 + 24.2 = 34.2$
 $\Rightarrow EC_3 = 34.2$

Overview of structural issues

General duration functions $p_i(\ell_i)$			
Start times		Completion times	
$ES \notin S_T$	$LS \notin S_T$	$EC \in C_T$	$LC \notin C_T$
S_T not convex		C_T not convex	
$[ES_i, LS_i]$ not feasible		$[EC_i, LC_i]$ feasible	

Convex duration functions $p_i(\ell_i)$			
Start times		Completion times	
$ES \notin S_T$	$LS \notin S_T$	$EC \in C_T$	$LC \notin C_T$
S_T convex		C_T convex	
$[ES_i, LS_i]$ feasible		$[EC_i, LC_i]$ feasible	

Constant durations functions $p_i(\ell_i)$			
Start times		Completion times	
$ES \in S_T$	$LS \in S_T$	$EC \in C_T$	$LC \in C_T$
S_T convex		C_T convex	
$[ES_i, LS_i]$ feasible		$[EC_i, LC_i]$ feasible	

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Temporal scheduling methods

Overview

- Earliest completion times
 - EC can be computed with efficient **label-correcting algorithm**
- Latest completion times
 - LC_j has to be calculated separately for each activity j
 - Since interval $[EC_j, LC_j]$ does only contain feasible completion times C_j : perform **binary search** on interval $[EC_j, \bar{d}]$
 - For each C_j check whether or not C_j is feasible using modified label-correcting algorithm
- Earliest and latest start times
 - ES_j : Determine maximum $l_{ij} \leq \min_{(h,j) \in E} (\bar{l}_{hj} + EC_i - EC_h)$ such that $C_j = EC_i - l_{ij} + p_j((l_{ij} + EC_h - EC_i)_{(h,j) \in E}) \leq LC_j$
 - LS_j : Introduce dummy activity i with $p_i = 0$ and $\bar{l}_{ij} = 0$, LS_j coincides with LC_j

Earliest completion schedule

Label-correcting algorithm

```

for all  $i \in V \setminus \{0\}$  do put  $C_i := -\infty$ ;
put  $C_0 := 0$ ,  $Q := \{0\}$ ; (*  $Q$  is a queue *)
while  $Q \neq \emptyset$  do
  pop  $i$  off queue  $Q$ ;
  for all  $(i, j) \in E$  do
    calculate  $\ell_j^*$  using equations (1)–(3);
    if  $C_j < C_i - \ell_{ij}^* + p_j(\ell_j^*)$  then
      update  $C_j := C_i - \ell_{ij}^* + p_j(\ell_j^*)$ ;
      if  $C_j > \bar{\ell}_{n+1,0}$  then terminate; (*  $C_T = \emptyset$  *)
      if  $j \notin Q$  then push  $j$  into queue  $Q$ ;
    end if
  end for
end while
return  $C$ ;

```

Check feasibility of completion time

Modified label-correcting algorithm checking feasibility of C_h

```

for all  $i \in V \setminus \{h\}$  do put  $C_i := -\infty$ ;
put  $Q := \{i\}$ ; (*  $Q$  is a queue *)
while  $Q \neq \emptyset$  do
  pop  $i$  off queue  $Q$ ;
  for all  $(i, j)$  do
    calculate  $\ell_j^*$ ;
    if  $C_j < C_i - \ell_{ij}^* + p_j(\ell_j^*)$  then
      if  $j = h$  then return false; (*  $C_h$  is not feasible *)
       $C_j := C_i - \ell_{ij}^* + p_j(\ell_j^*)$ ;
      if  $j \notin Q$  then push  $j$  into queue  $Q$ ;
    end if
  end for
end while
return true; (*  $C_h$  is feasible *)

```

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Performance analysis

Test bed

- Temporal scheduling methods implemented under MS Visual C++ 6.0 Developer Studio
- Intel Pentium 1.7 GHz PC with 524 MB RAM running under Windows 2000 professional
- Full factorial design experiment with 2,160 instances

Symbol	Parameter	Values
p	number of (sub-)projects	2, 5, 10
n	number of real activities per project	10, 20, 50
OS	order strength	0.25, 0.5

- Duration functions: nonconvex 3rd-order polynomials

Performance analysis

Impact of number of projects on CPU times [ms]

	$p = 2$	$p = 5$	$p = 10$
CPU_{EC}	0.5	2.3	3.0
CPU_{LC}	824.3	5,572.8	9,729.0

Impact of number of activities per project on CPU times [ms]

	$n = 10$	$n = 20$	$n = 50$
CPU_{EC}	0.4	0.9	4.4
CPU_{LC}	266.6	1,462.3	14,397.2

Impact of order strength on CPU times [ms]

	$OS = 0.25$	$OS = 0.5$
CPU_{EC}	1.6	2.2
CPU_{LC}	3,604.2	7,146.5

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Conclusions

Summary

- Concurrent engineering projects
- Trade-off between overlap times and activity durations
- Earliest completion schedule is feasible, remaining extremal schedules are not feasible
- Algorithms perform reasonably well for project portfolios with up to 500 activities

Expansions

- Priority-rule based method for resource-constrained variant of the problem
- Objective function: earliness-tardiness cost with respect to due date
- Sequential version: mean CPU time less than one second