

Real-Time Scheduling

Formal Model

[Some parts of this lecture are based on a real-time systems course
of Colin Perkins

<http://csperkins.org/teaching/rtes/index.html>]

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- ▶ Introduce an abstract model of real-time systems
 - ▶ abstracts away unessential details
 - ▶ sets up consistent terminology

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 - ▶ sets up consistent terminology
- ▶ Three components of the model
 - ▶ A workload model that describes applications supported by the system
i.e. jobs, tasks, ...
 - ▶ A resource model that describes the system resources available to applications
i.e. processors, passive resources, ...
 - ▶ Algorithms that define how the application uses the resources at all times
i.e. scheduling and resource access protocols

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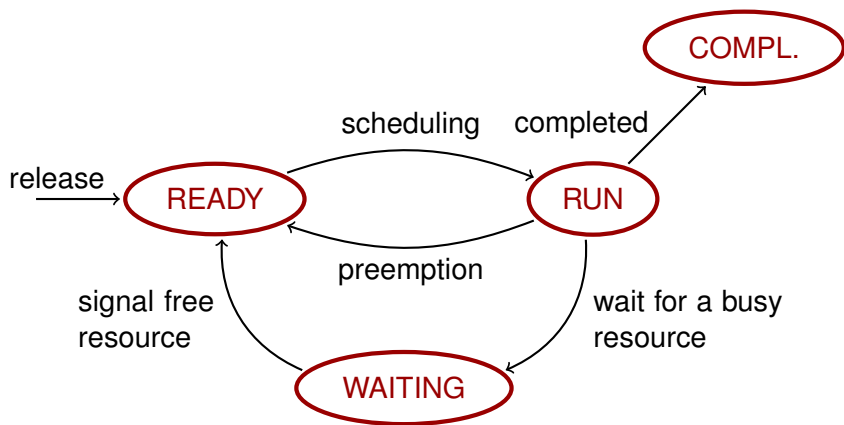
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CPU, transmission link in a network, database server, etc.
- ▶ A job may use some (shared) passive *resources*
file, database lock, shared variable etc.

Life Cycle of a Job



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There are four types of job parameters:

- ▶ temporal
 - ▶ release time, execution time, deadlines
- ▶ functional
 - ▶ Laxity type: hard and soft real-time
 - ▶ preemptability, (criticality)
- ▶ interconnection
 - ▶ precedence constraints
- ▶ resource
 - ▶ usage of processors and passive resources

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 - ▶ Conditional branches
 - ▶ Caches, pipelines, etc.
 - ▶ ...
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We usually validate the system using only e_i^+ for each job
i.e. assume $e_i = e_i^+$

Job Parameters – Release and Response Time

Release time r_i – the instant in time when a job J_i becomes available for execution

- ▶ Release time may *jitter*, only an interval $[r_i^-, r_i^+]$ is known
- ▶ A job can be executed at any time at, or after, its release time, provided its processor and resource demands are met

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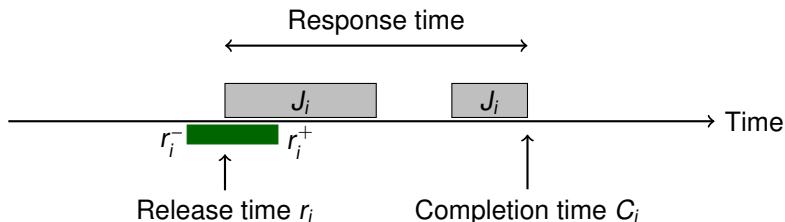
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Response time – the difference $C_i - r_i$ between the completion time and the release time



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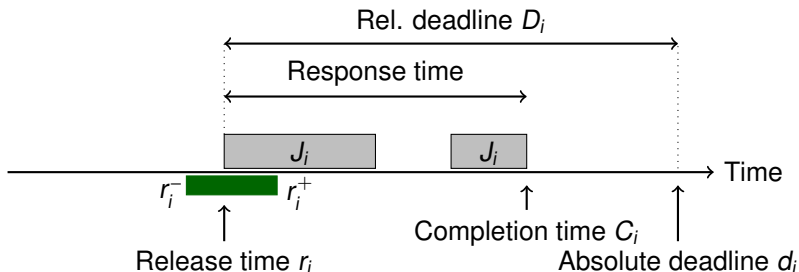
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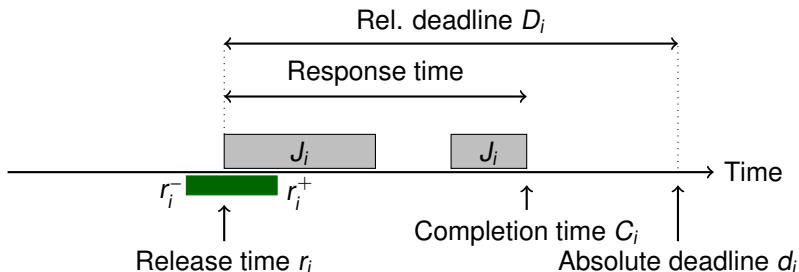


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A *timing constraint* of a job is specified using release time together with relative and absolute deadlines.

Laxity Type – Hard Real-Time

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Definition 1

A *timing constraint is hard* if the user requires *formal validation* that the job meets its timing constraint.

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Definition 2

A *timing constraint is soft* if either validation is not required, or only a demonstration that a *statistical constraint* is met suffices.

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Reasons for preemptability:

- ▶ Jobs may have different levels of criticality
e.g. brakes vs radio tuning
- ▶ Priorities may make part of scheduling algorithm
e.g. resource access control algorithms

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- ▶ J_i is an *immediate predecessor* of J_k if $J_i < J_k$ and there is no other job J_j such that $J_i < J_j < J_k$
- ▶ J_i and J_k are *independent* when neither $J_i < J_k$ nor $J_k < J_i$

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A job with a precedence constraint becomes ready for execution when its release time has passed and when all predecessors have completed.

Example: authentication before retrieving an information, a signal processing task in radar surveillance system precedes a tracker task

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We consider three types of tasks

- ▶ Periodic – jobs executed at regular intervals, hard deadlines
- ▶ Aperiodic – jobs executed in random intervals, soft deadlines
- ▶ Sporadic – jobs executed in random intervals, hard deadlines

... precise definitions later.

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Multi-processor scheduling is a rich area of current research, we touch it only lightly (later).

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Resource requirements of a job specify

- ▶ which resources are used by the job
- ▶ the time interval(s) during which each resource is required
(precise definitions later)

Scheduling

Schedule assigns, in every time instant, processors and resources to jobs.

More formally, a schedule is a function

$$\sigma : \{J_1, \dots\} \times \mathbb{R}_0^+ \rightarrow \mathcal{P}(\{P_1, \dots, P_m, R_1, \dots, R_n\})$$

so that for every $t \in \mathbb{R}_0^+$ there are rational $0 \leq t_1 \leq t < t_2$ such that $\sigma(J_i, \cdot)$ is constant on $[t_1, t_2)$.

(We also assume that there is the least time quantum in which scheduler does not change its decisions, i.e. each of the intervals $[t_1, t_2)$ is larger than a fixed $\varepsilon > 0$.)

Valid and Feasible Schedule

A schedule is *valid* if it satisfies the following conditions:

- ▶ Every processor is assigned to at most one job at any time
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A set of jobs is *schedulable* if there is a feasible schedule for the set.

Scheduling – Algorithms

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Definition 3

A scheduling algorithm is *optimal* if it always produces a feasible schedule whenever such a schedule exists.

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Individual Jobs

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We proceed in the direction of growing generality:

1. No resources, independent, synchronized (i.e. $r_i = 0$ for all i)
2. No resources, independent but not synchronized
3. No resources but possibly dependent
4. The general case

No resources, Independent, Synchronized

	J_1	J_2	J_3	J_4	J_5
e_i	1	1	1	3	2
d_i	3	10	7	8	5

Is there a feasible schedule?

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Proof.

Let σ be a schedule. **Inversion** is a pair (J_a, J_b) such that J_a precedes J_b in σ but $d_b < d_a$.

Note that σ is EDD iff it does not contain any inversion.

Proof cont.

Assume $k > 0$ inversions in σ .

Let (J_a, J_b) be an inversion such that J_a is scheduled right before J_b .

There is always at least one such inversion (homework).

Let $t_a < t_b$ be the time instants when J_a, J_b start to be executed in σ .

Recall: C_a, C_b are completion times of J_a, J_b , and e_a, e_b are execution times.

Note that $C_a \leq d_a$ and that $C_b \leq d_b < d_a$.

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Note that $C_a \leq d_a$ and that $C_b \leq d_b < d_a$.

Define a new schedule σ' in which:

- ▶ All jobs except J_a, J_b are scheduled as in σ ,
- ▶ J_b starts at t_a ,
- ▶ J_a starts at $t_a + e_b$.

Observe that σ' is still feasible:

- ▶ J_b is completed at $t_a + e_b < t_a + e_b + e_a = t_b + e_b = C_b \leq d_b$
- ▶ J_a is completed at $t_a + e_b + e_a = C_b \leq d_b < d_a$

Note that σ' has $k - 1$ inversions. By repeating the above procedure k times, we obtain an EDD schedule. □

No resources, Independent, Synchronized

Is there any simple schedulability test?

$\{J_1, \dots, J_n\}$ where $d_1 \leq \dots \leq d_n$ is schedulable iff
 $\forall i \in \{1, \dots, n\} : \sum_{k=1}^i e_k \leq d_i$

No resources, Independent (No Synchro)

	J_1	J_2	J_3
r_i	0	0	2
e_i	1	2	2
d_i	2	5	4

- ▶ find a (feasible) schedule (with and without preemption)
- ▶ determine response time of each job in your schedule

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Preemption makes a difference.

No resources, Independent (No Synchro)

Earliest Deadline First (EDF) scheduling:

At any time instant, a job with the earliest absolute deadline is executed

Here EDF works in the preemptive case but not in the non-preemptive one.

	J_1	J_2
r_i	0	1
e_i	4	2
d_i	7	5

No Resources, Independent (No Synchro)

Theorem 5

If there are no resource contentions, jobs are independent and preemption is allowed, the EDF algorithm finds a feasible schedule (if it exists).

Proof.

We show that any feasible schedule σ can be transformed in finitely many steps to EDF schedule which is feasible.

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Theorem 5

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Proof.

We show that any feasible schedule σ can be transformed in finitely many steps to EDF schedule which is feasible.

Let σ be a feasible schedule but not EDF. Assume, w.l.o.g., that for every $k \in \mathbb{N}$ at most one job is executed in the interval $[k, k + 1)$ and that all release times and deadlines are in \mathbb{N} .

(Otherwise rescale by the least common multiple.)

No Resources, Independent (No Synchro)

Proof cont.

We say that σ **violates** EDF at k if there are two jobs J_a and J_b that satisfy:

- ▶ J_a and J_b are ready for execution at k
- ▶ J_a is executed in $[k, k + 1)$
- ▶ $d_b < d_a$

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Let $k \in \mathbb{N}$ be the *least* time instant such that σ violates EDF at k as **witnessed** by jobs J_a and J_b .

Assume, w.l.o.g. that J_b has the minimum deadline among all jobs ready for execution at k .

There is $k < \ell < d_b$ such that J_b is executed in $[\ell, \ell + 1)$.

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There is $k < \ell < d_b$ such that J_b is executed in $[\ell, \ell + 1)$.

Let us define a new schedule σ' which is the same as σ except:

- ▶ executes J_b in $[k, k + 1)$
- ▶ executes J_a in $[\ell, \ell + 1)$

Then σ' is feasible and does not violate EDF at any $k' \leq k$.

Finitely many steps transform any feasible schedule to EDF. □

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Exhaustive search through partial schedules

- ▶ start with an empty schedule
- ▶ in every step either
 - ▶ add a job which maximizes a *heuristic function* H among jobs that have not yet been tried in this partial schedule
 - ▶ or backtrack if there is no such a job

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The **non-preemptive** case is **NP-hard**.

Heuristics are needed, such as the **Spring algorithm**, that usually work in much more general setting (with resources etc.)

Use the notion of *partial schedule* where only a subset of tasks has been scheduled.

Exhaustive search through partial schedules

- ▶ start with an empty schedule
- ▶ in every step either
 - ▶ add a job which maximizes a *heuristic function* H among jobs that have not yet been tried in this partial schedule
 - ▶ or backtrack if there is no such a job
- ▶ After failure, backtrack to previous partial schedule

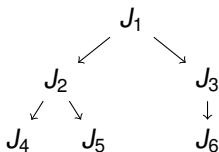
Heuristic function identifies plausible jobs to be scheduled (earliest release, earliest deadline, etc.)

No Resources, Dependent (No Synchro)

Example:

	J_1	J_2	J_3	J_4	J_5	J_6
e_i	1	1	1	1	1	1
d_i	2	5	4	3	5	6

Dependencies:



Does EDF work?

No resources, Dependent (No Synchro)

Theorem 6

Assume that there are no resource contentions and jobs are preemptable. There is a polynomial time algorithm which decides whether a feasible schedule exists and if yes, then computes one.

Idea: Reduce to independent jobs by changing release times and deadlines. Then use EDF.

No resources, Dependent (No Synchro)

Theorem 6

Assume that there are no resource contentions and jobs are preemptable. There is a polynomial time algorithm which decides whether a feasible schedule exists and if yes, then computes one.

Idea: Reduce to independent jobs by changing release times and deadlines. Then use EDF.

Observe that if $J_i < J_k$ then replacing

- ▶ r_k with $\max\{r_k, r_i + e_i\}$
(J_k cannot be scheduled for execution before $r_i + e_i$ because J_i cannot be finished before $r_i + e_i$)
- ▶ d_i with $\min\{d_i, d_k - e_k\}$
(J_i must be finished before $d_k - e_k$ so that J_k can be finished before d_k)

does not change feasibility.

Replace systematically according to the precedence relation.

No Resources, Dependent (No Synchro)

Define r_k^*, d_k^* systematically as follows:

- ▶ Pick J_k whose all predecessors have been processed and compute $r_k^* := \max\{r_k, \max_{J_i < J_k} r_i^* + e_i\}$. Repeat for all jobs.
- ▶ Pick J_k whose all successors have been processed and compute $d_k^* := \min\{d_k, \min_{J_k < J_i} d_i^* - e_i\}$. Repeat for all jobs.

No Resources, Dependent (No Synchro)

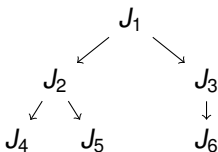
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No Resources, Dependent (No Synchro)

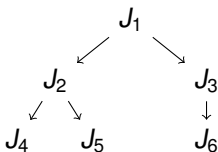
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Do you need the precedence constraints?

No Resources, Dependent (No Synchro)

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This gives a new set of jobs J_1^*, \dots, J_m^* where each J_k^* has the release time r_k^* and the absolute deadline d_k^* .

We impose **no precedence constraints** on J_1^*, \dots, J_m^* .

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Lemma 7

$\{J_1, \dots, J_m\}$ is feasible iff $\{J_1^, \dots, J_m^*\}$ is feasible. If EDF schedule is feasible on $\{J_1^*, \dots, J_m^*\}$, then the same schedule is feasible on $\{J_1, \dots, J_m\}$.*

The same schedule means that whenever J_i^ is scheduled at time t , then J_i is scheduled at time t .*

No Resources, Dependent (No Synchro)

Recall: $r_k^* := \max\{r_k, \max_{J_i < J_k} r_i^* + e_i\}$ and
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Proof of Lemma ??.

\Rightarrow : It is easy to show that in *no feasible schedule* on $\{J_1, \dots, J_m\}$ any job J_k can be executed before r_k^* and completed after d_k^* (otherwise, precedence constraints would be violated).

No Resources, Dependent (No Synchro)

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\Leftarrow : Assume that EDF σ is feasible on $\{J_1^*, \dots, J_m^*\}$. Let us use σ on $\{J_1, \dots, J_m\}$.

I.e. J_i is executed iff J_i^* is executed.

No Resources, Dependent (No Synchro)

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No Resources, Dependent (No Synchro)

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Precedence constraints: Assume that $J_s < J_t$. Then J_s^* executes completely before J_t^* since $r_s^* < r_s^* + e_s \leq r_t^*$ and $d_s^* \leq d_t^* - e_t < d_t^*$ and σ is EDF on $\{J_1^* \dots, J_m^*\}$.

Resources, Dependent, Not Synchronized

Even the preemptive case is NP-hard

- ▶ reduce the non-preemptive case without resources to the preemptive with resources
- ▶ Use a common resource R .
 - ▶ Whenever a job starts its execution it locks the resource R .
 - ▶ Whenever a job finishes its execution it releases the resource R .

Could be solved using heuristics, e.g. the Spring algorithm.