# Scheduling on unreliable machines AEOLUS Workshop on Scheduling 

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## Overview

The setting

Identical machines
Re-using knowledge
Further constraints
The continuous case

Non-identical machines

A different look at related machines

## The setting

Given a set J of preemptible jobs, a set $M$ of machines precedence constraints, release times
Problem machines may "fail" online: only $M(t) \subseteq M$ will contribute at time $t$.
Goal minimize makespan or sum of completion times

## A simple example

## Example

Identical machines, failure probability $0 \leq f<1$ constant. Minimize $\sum C_{j}$.

## Main Idea

This would be easy if machines couldn't fail. (SRPT)
Use as much information from such a solution as possible.
Two steps:

1. Build optimal offline schedule for all $m$ machines.
2. Online:

- try to clear up backlog
- do as the offline schedule says


## A simple example (cont.)

Formally:
Algorithm MIMIC

1. Calculate offline schedule
2. Build queue: job on machine $i$ in interval $t$ goes into position $t m+i$.
3. $m^{\prime}$ machines available online: schedule first $m^{\prime}$ jobs from queue.

## Remark

Step 1, 2 need not be explicit.

## A simple example (cont.)

Offline

| Job 2 |  |
| :--- | :--- |
| Job 3 |  |
| J. 1 | Job 4 |

Queue

| 2 | 3 | 1 | 2 | 3 | 4 | 2 | 3 | 4 |  |  | 4 |  |  | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Online

## A simple example (cont.)

Offline

| Job 2 |  |
| :---: | :---: |
| Job 3 |  |
| J. 1 | Job 4 |

Queue

| 2 | 3 | 1 | 2 | 3 | 4 | 2 | 3 | 4 |  |  | 4 |  |  | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Online

| J. 2 |
| :--- |
| J. 3 |
| $\boldsymbol{x}$ |

$X$

## A simple example (cont.)

Offline

| Job 2 |  |
| :--- | :--- |
| Job 3 |  |
| J. 1 | Job 4 |

Queue

| 2 | 3 | 1 | 2 | 3 | 4 | 2 | 3 | 4 |  |  | 4 |  |  | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Online

| J. 2 |
| :--- |
| J. 3 |

$x \times$

## A simple example (cont.)

Offline

| Job 2 |  |
| :--- | :--- |
| Job 3 |  |
| J. 1 | Job 4 |

Queue

| 2 | 3 | 1 | 2 | 3 | 4 | 2 | 3 | 4 |  |  | 4 |  |  | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Online

| J. 2 | J. 1 |
| :--- | :--- |
| J. 3 | J. 2 |
| $X \quad X$ |  |

## A simple example (cont.)

Offline

| Job 2 |  |  |
| :--- | :--- | :--- |
| Job 3 |  |  |
|  |  |  |
| J. 1 Job 4 |  |  |

Queue

| 2 | 3 | 1 | 2 | 3 | 4 | 2 | 3 | 4 |  |  | 4 |  |  | 4 |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Online

| J. | J. 1 | J. 3 | J. 3 |  |
| :---: | :---: | :---: | :---: | :---: |
| J. | J. 2 | J. 4 | J. 4 | J. 4 J. 4 |
| X | X | J. 2 |  |  |

## A simple example (cont.)

## Example

Identical machines, failure probability $0 \leq f<1$ constant.

## Lemma

Any job's expected completion time is delayed from $C_{\jmath}$ to $\frac{1}{1-f} C_{j}+1$.

Theorem
MIMIC is a $\frac{1}{1-f}$-approximation for $C_{\text {max }}, \sum C_{j}, \sum w_{j} C_{j}$. (Asymptotically.)

## More structured instances

Release dates results hold trivially.
Precedences work only sometimes:
Offline


- In-trees always work
- Otherwise: may create one idle step per job


## A continuous model of time

Up to now: things happen in discrete time steps.

## Semi-online setting

- preemption at any time
- we know the next time the set of available machines changes (event).

Known:

## Theorem (Albers/Schmidt 99)

There is an optimal polynomial-time online algorithm for the $C_{\max }$ objective and independent jobs on identical machines.

## MIMIC in the continuous case

- Calculate online area until next event.
- Consider corresponding offline interval.
- Insert artificial events for job termination.
- Schedule jobs with McNaughton's wraparound rule.

Offline

| Job 5 |  | Job 10 |  |
| :---: | :---: | :---: | :---: |
|  | Job 4 | Job 9 |  |
| Job 3 |  | Job 8 |  |
| Jpb 2 |  | Job 7 |  |
| Job 1 |  | Job 6 |  |

## Online



## MIMIC in the continuous case

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- Consider corresponding offline interval.
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Offline


## Online



## MIMIC in the continuous case

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Offline

| Job 5 |  | Job 10 |  |
| :---: | :---: | :---: | :---: |
| Job 4 |  | Job 9 |  |
| Jdb 3 |  | Job 8 |  |
| Job 2 |  | Job 7 |  |
| Job 1 |  | Job 6 |  |

## Online



## Non-identical machines: it's not that easy

When machines are not identical, migration can be harmful:

Offline

| (Speed 4) | Job 1 |
| :--- | :--- |
| (Speed 1) | Job 2 |
| (Speed 1) | Job 3 |

Online
(Speed 4) $\times \times \times \times \times \times$
(Speed 1)
(Speed 1)

## Non-identical machines: it's not that easy

When machines are not identical, migration can be harmful:

Offline

| (Speed 4) | Job 1 |
| :--- | :--- |
| (Speed 1) | Job 2 |
| (Speed 1) | Job 3 |

Online
(Speed 4) $\times \times \times \times \times \times$

|  | (Speed 1) |  |  |
| :--- | :--- | :--- | :--- |
| Job 1 |  |  |  |
| (Speed 1) | Job 3 |  |  |
|  | Job 2 | Job 1 |  |
|  |  |  |  |

## A natural extension to non-identical machines

## Offline

- Next event offline: $t+d t$.
- Next event online: $T+d T$.
- Schedule "as much as possible" of $[t, t+d t]$ into $[T, T+d T]$.
$\Longrightarrow$ at least one interval will be used up


Online
T

$$
T+d T
$$

$x$
$\times \times \times \times \times \times \times \times$

## How much is "as much as possible"?

## Offline

- consider all jobs running in $[t, t+d t]$
- approximately solve
$R|p m t n| C_{\text {max }}$
- on online machineset $M(T)$
- fits: ok, exhausts $[t, t+d t]$



## How much is "as much as possible"?

## Offline

- consider all jobs running in $[t, t+d t]$
- approximately solve $R|p m t n| C_{\text {max }}$
- on online machineset $M(T)$
- doesn't fit: scale solution


## Online



## How much is "as much as possible"?

## Offline

- consider all jobs running in $[t, t+d t]$
- approximately solve $R|p m t n| C_{\text {max }}$
- on online machineset $M(T)$
- doesn't fit: scale solution
- exhaust $[T, T+d T]$

Online


## A different look at related machines

The algorithm look ahead

- for the current interval $[t, t+\delta)$ :
- find the smallest $r$ such that:
- Some longest jobs are executed by $\delta$
- some jobs are shortened to remaining execution time $r$
- jobs shorter than $r$ are not executed
- total area is $m(t) \delta$
- schedule with McNaughton's wraparound rule


## Theorem (Albers, Schmidt 99)

look ahead minimizes the makespan for identical machines.

## The algorithm, in a picture

## timing diagram

- x axis: online time
- y axis: remaining processing time per job
- slope: machine speed
look ahead
- give machines to jobs
with highest remaining time
- when lines intersect:
jobs "share" the machines for rest of interval


## The algorithm, extended to related machines

look ahead/fastest machine

- give fastest machines to jobs with highest remaining time
- when lines intersect: jobs "share" the machines for rest of interval

By similar proof as before:
Theorem
la/fm minimizes the makespan
 for related machines.

## Summary

- MIMIC: use offline algorithms for online scheduling
+ handles release times and precedences
+ good bounds for simple stochastic models
+ all completion time objectives
- hard to give bounds for complex stochastic models (aging machines, different reliability)
- hard to give competitive ratio
- cannot handle flow time objectives

