

# On Packet Scheduling with Adversarial Jamming and Speedup

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Aussios, April 7, 2018

## Goal of this talk

Simple online scheduling model with an open problem.

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## Outline

- Model
- Algorithm
- Local analysis
- Non-local analysis
- Lower bounds

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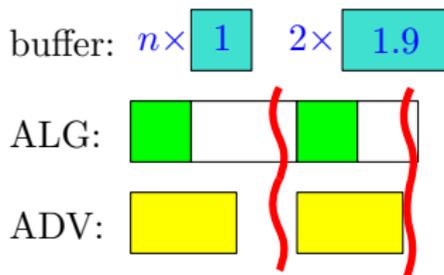
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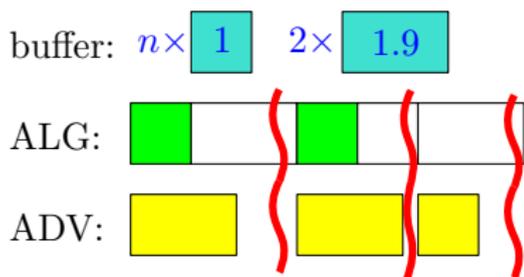
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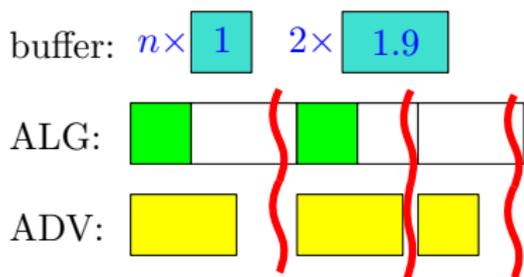
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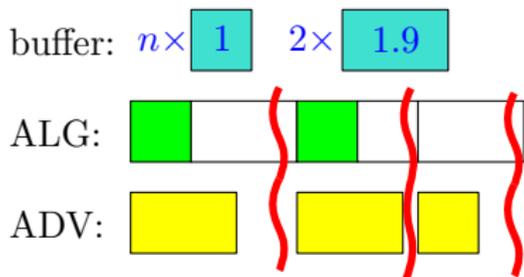
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We focus on deterministic algorithms only.

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## Speedup for 1-competitiveness on general instances

- a lower bound of 2 [Anta et al. '15]
- but no good algorithm

Speedup  $s = \text{ALG}$  needs time only  $\ell/s$  to send a packet of size  $\ell$

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## Lower bounds

No 1-competitive deterministic algorithm with speedup  $s < \phi + 1 \approx 2.618$

# Algorithm – Description

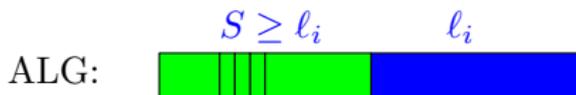
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- fault occurs,
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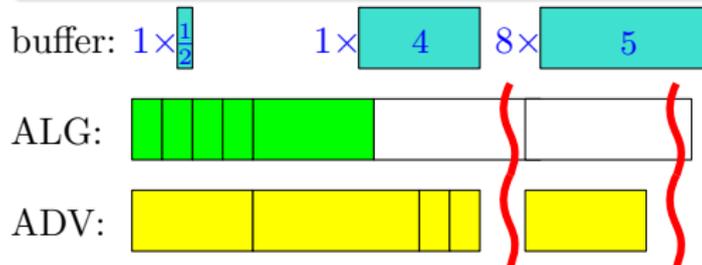
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## Nice properties of the new algorithm

- no unnecessary idle time
- the same algorithm for all speeds
- no need to know the speed and packet sizes in advance

# Algorithm – Observations

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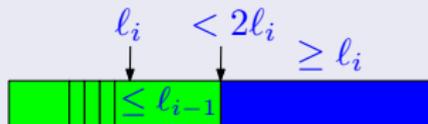
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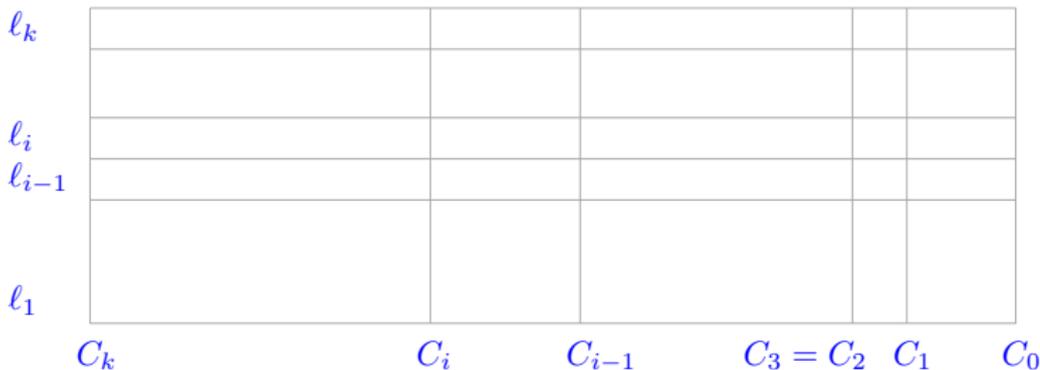
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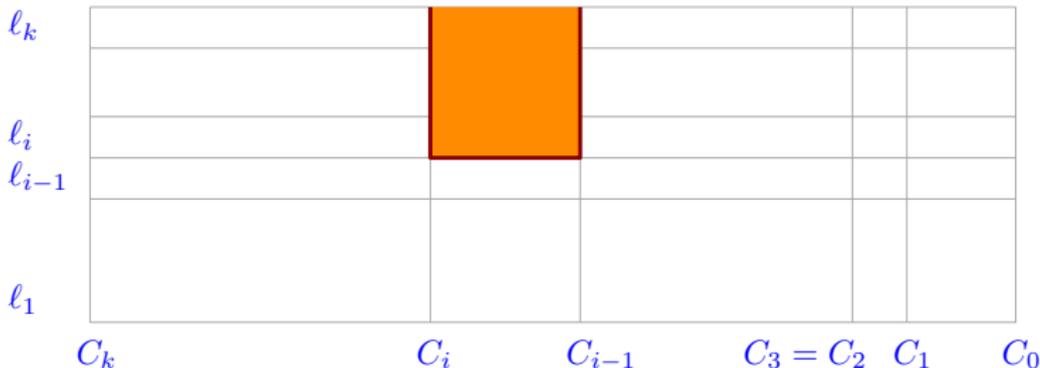


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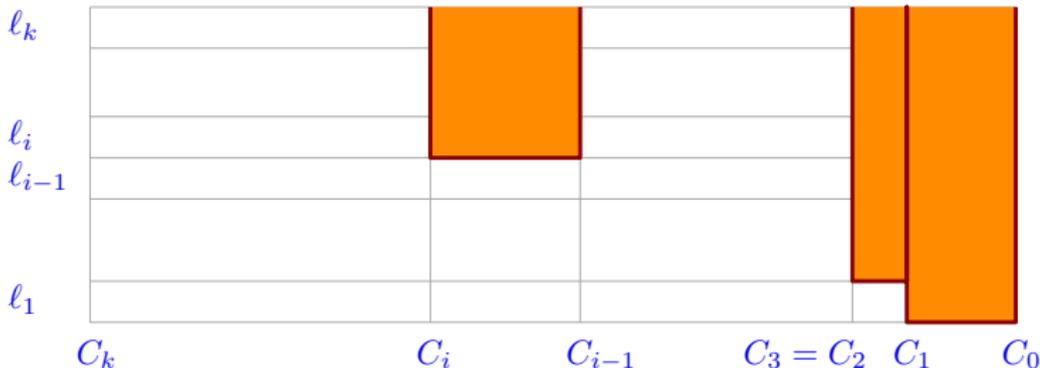
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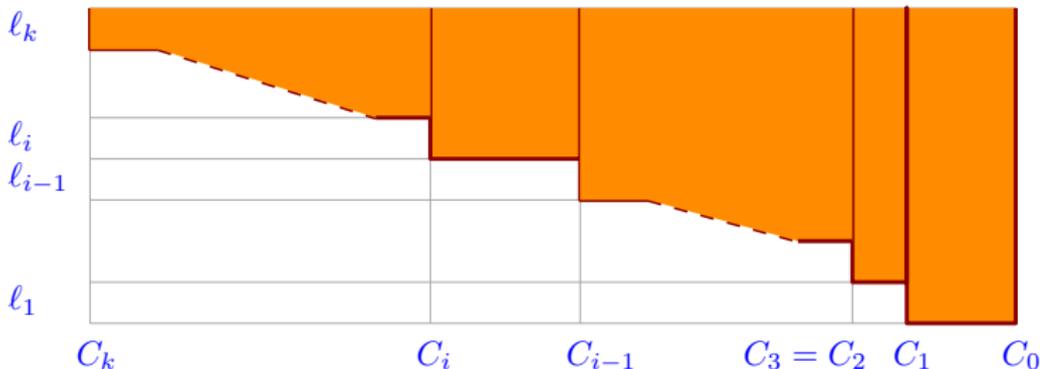
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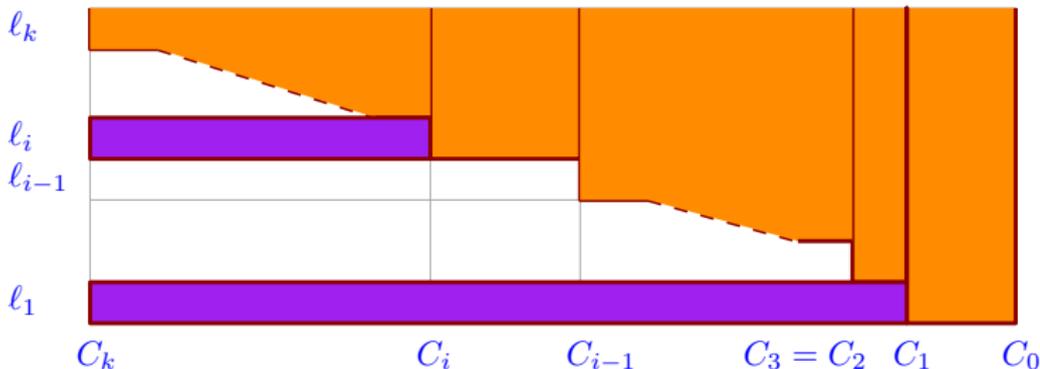
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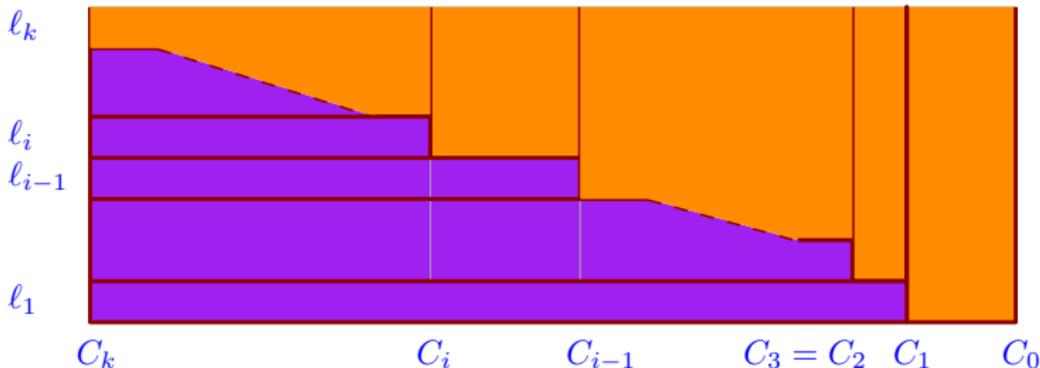
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# Local analysis – General instances, speedup 6

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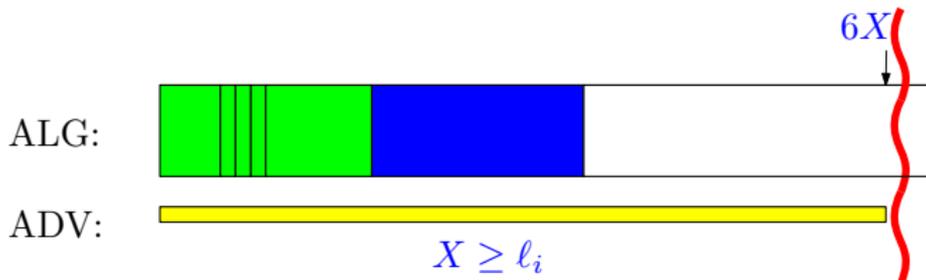
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# Local analysis – General instances, speedup 6

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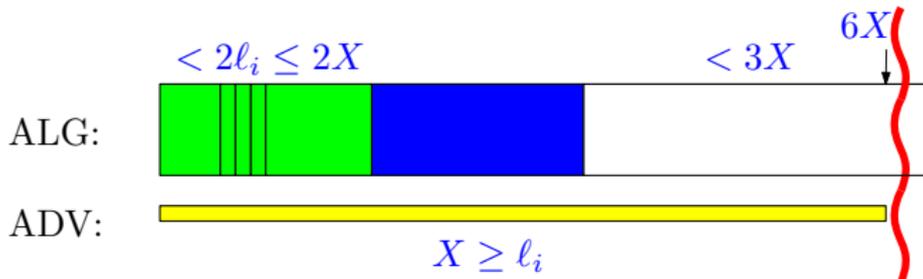


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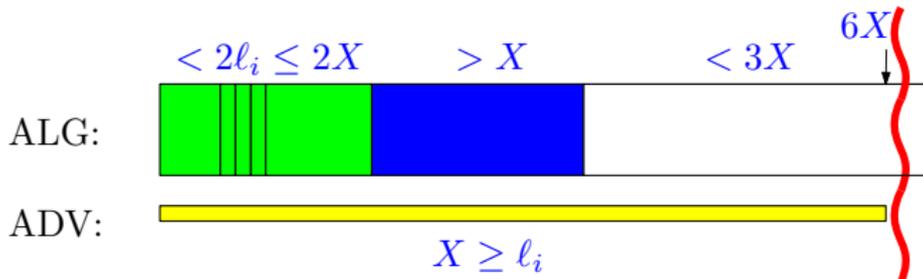


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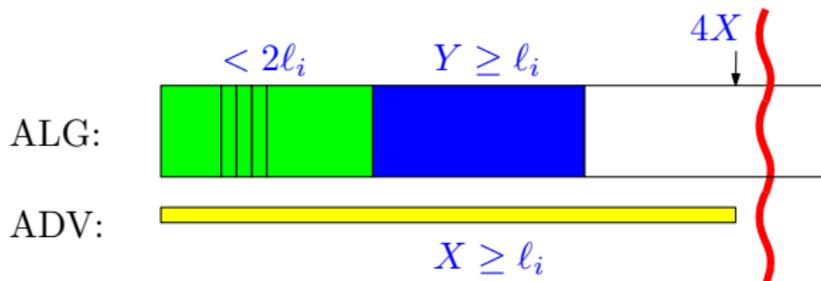


# General instances, speedup 4

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For each phase within  $(C_i, C_{i-1}]$ , show that the total size of long packets ( $\geq l_i$ ) completed by **ALG** is at least that of **ADV**

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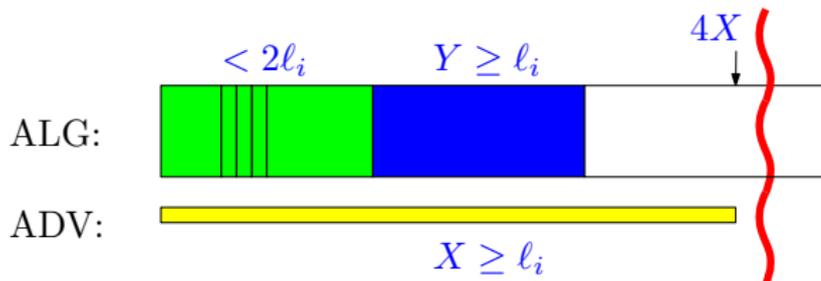
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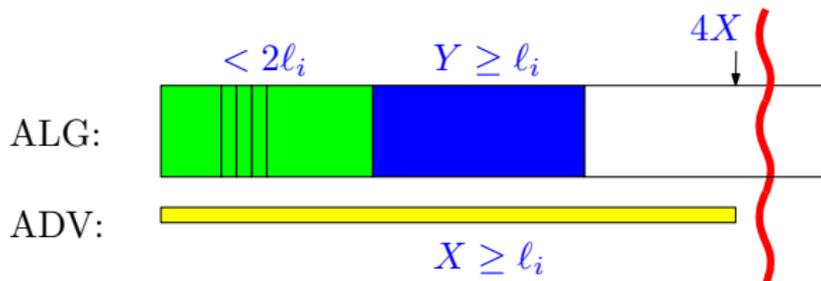
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- $Y$  completed as  $Y < 2l_i$ 
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- It may happen that  $X = l_{i+1} > l_i = Y \dots$   
 $\dots$  but only if no packet of size  $l_{i+1}$  is pending.

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Redefine critical times:  $C'_i$  satisfy:

- almost no packets of size  $l_i$  pending just before  $C'_i$ ,
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We may have e.g.  $C'_4 > C'_1 > C'_2 = C'_5 > C'_3$ .

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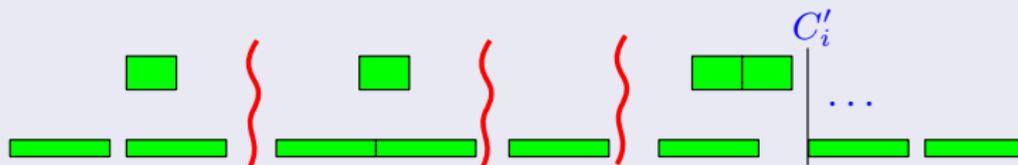
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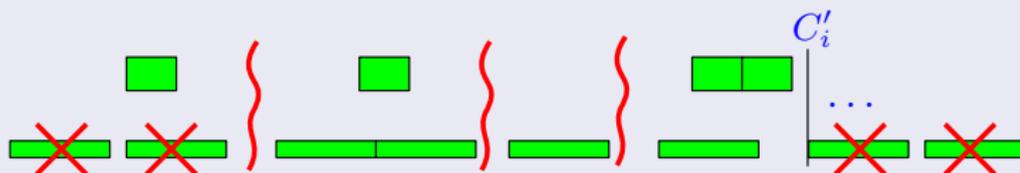
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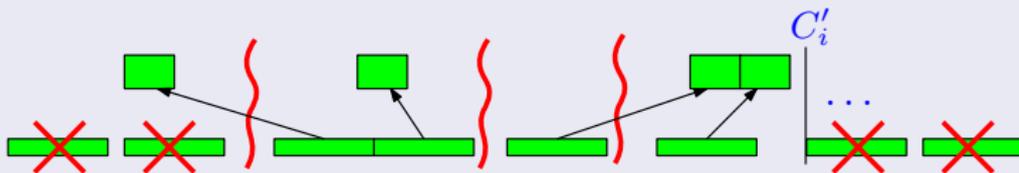
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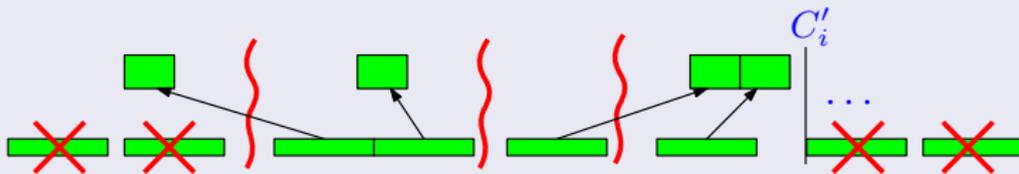
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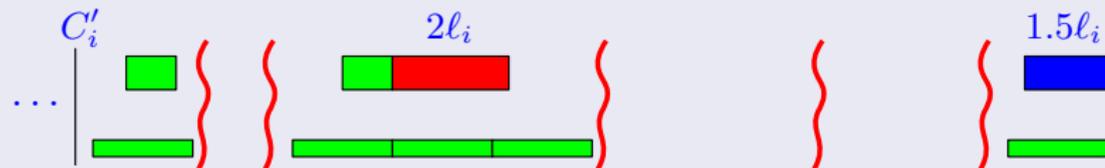
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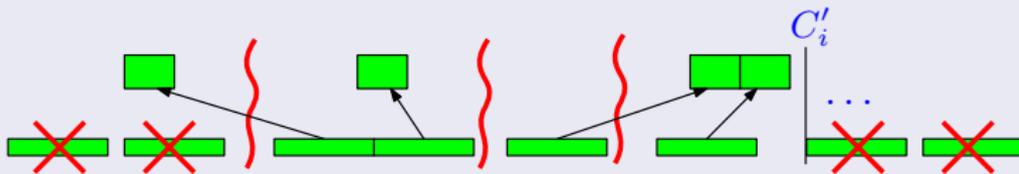
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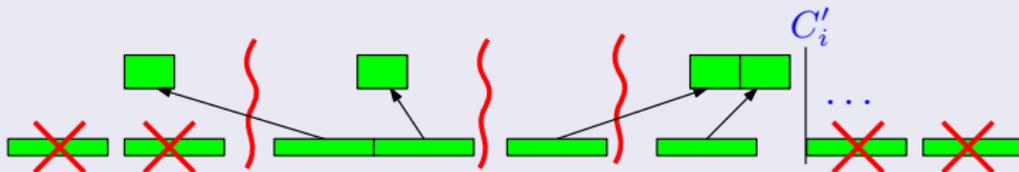


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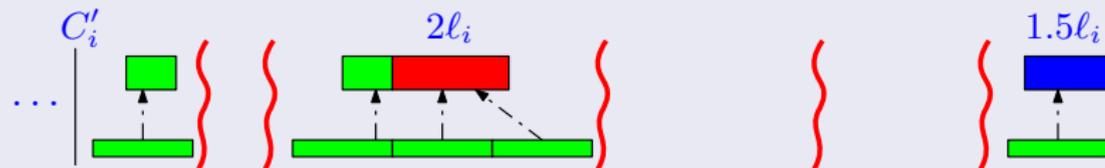
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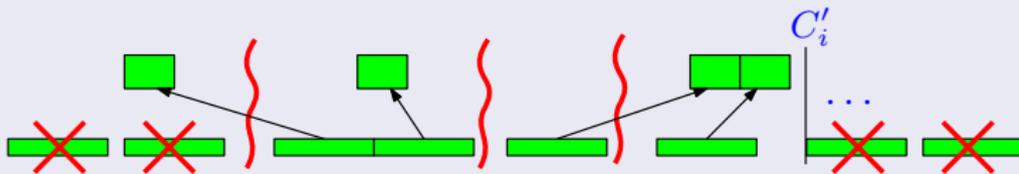
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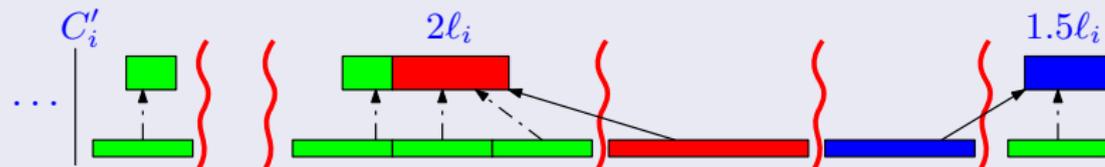
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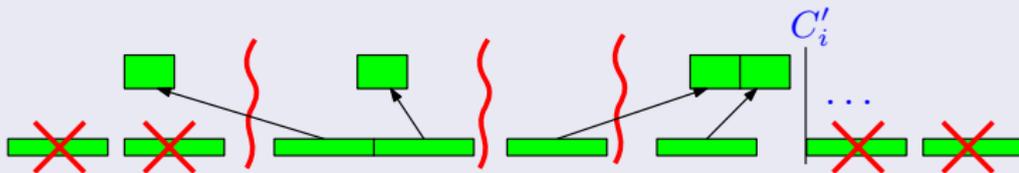
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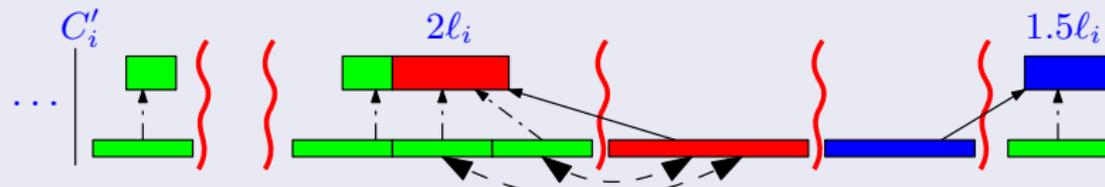
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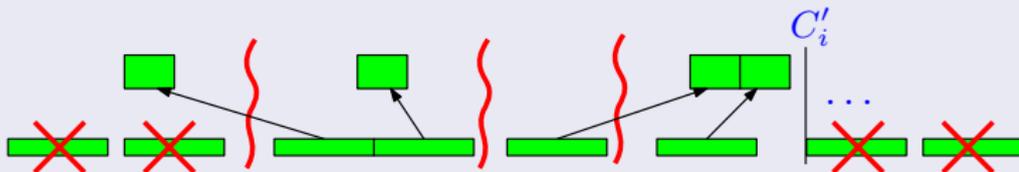
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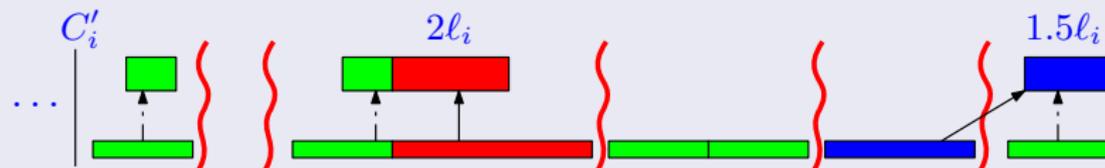
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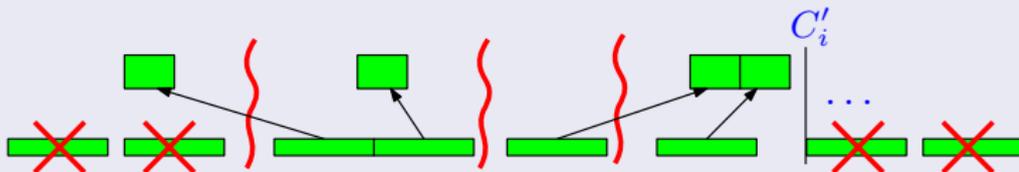
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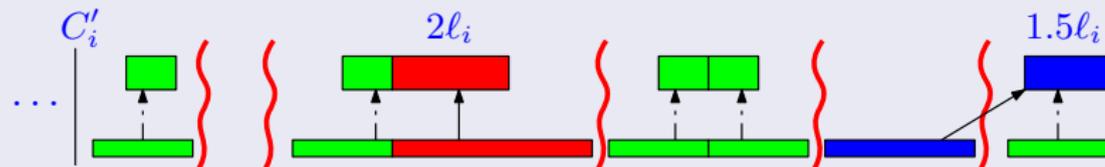
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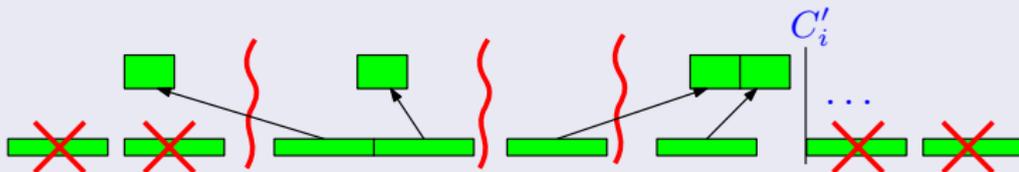
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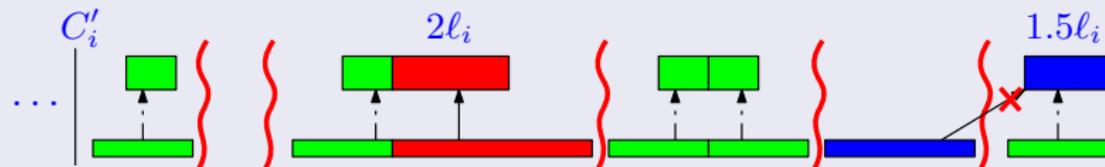
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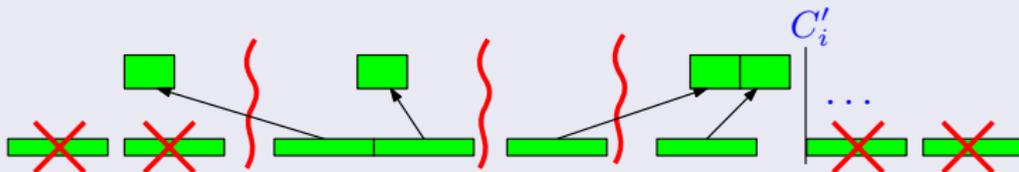
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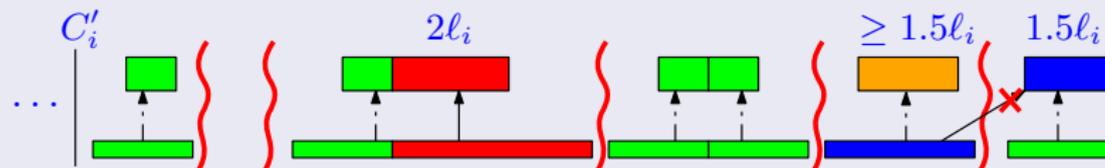
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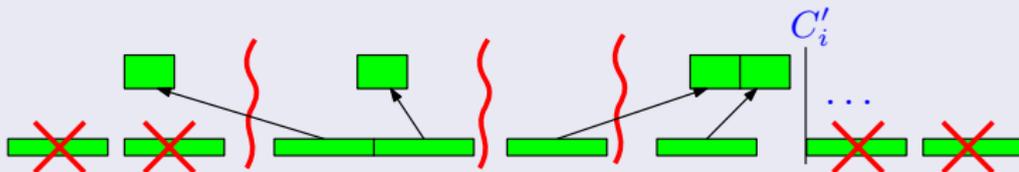
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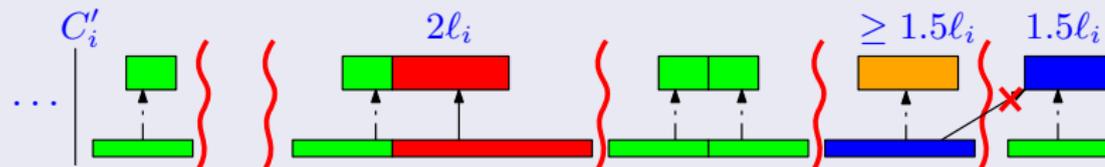
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+ quite a lot of technical work (e.g., phases in which ALG completes no packet)

# Lower bound – Speed below 2

No deterministic 1-competitive algorithm with speedup  $< 2$

## Input

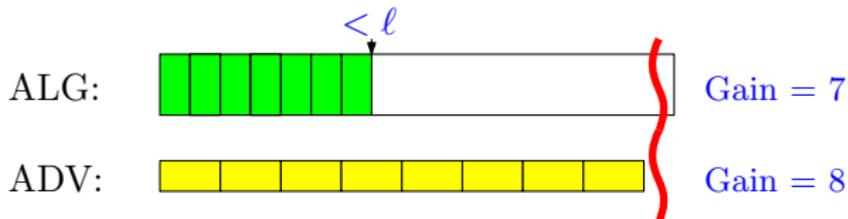
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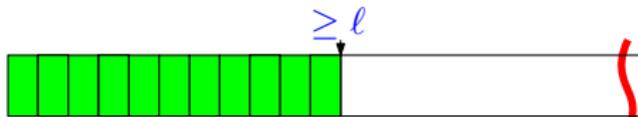
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ALG:



ADV:



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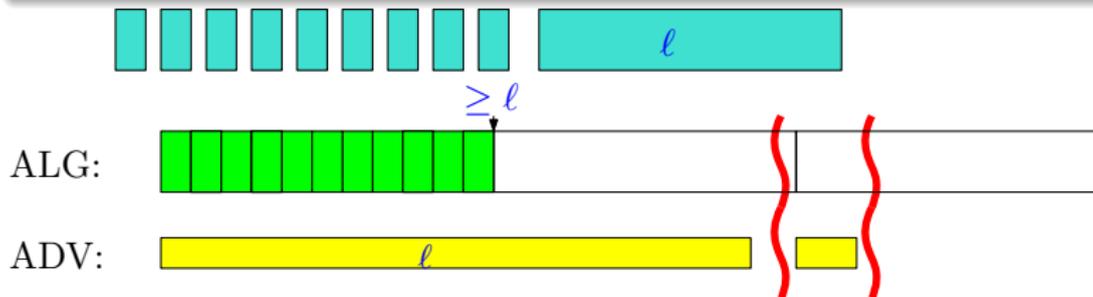
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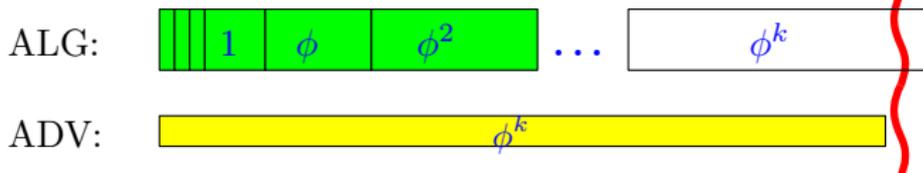
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# Lower bound – Speed below $\phi + 1 \approx 2.618$

- packet sizes  $\varepsilon, 1, \phi, \phi^2, \dots, \phi^k$ ; all arrive at time 0,
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+ two other similar cases

+ when ADV completes all packets  $\phi^i$ , then it completes packets  $< \phi^i$  preventing ALG to finish a packet  $\geq \phi^i$

# Open Problems (for the way back home)

- 1-competitive algorithm with speedup  $s < 4$

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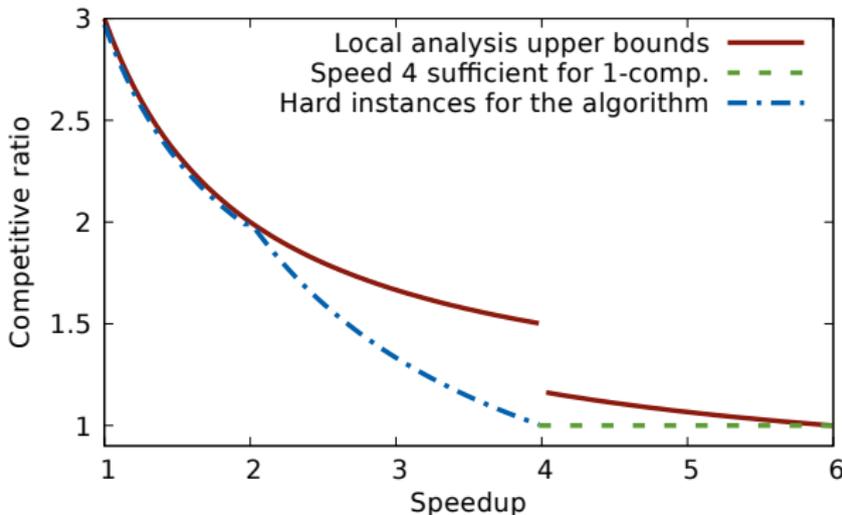
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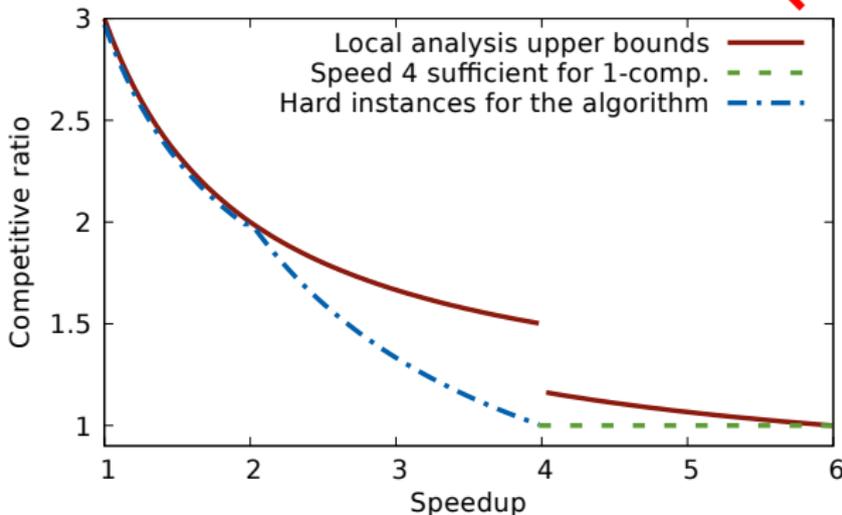
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Thank You!



# Local analysis results for special cases

Divisible instances ( $\ell_i$  divides  $\ell_{i+1}$  for each  $i$ ):

- Our algorithm is 1-competitive with speedup 2.5

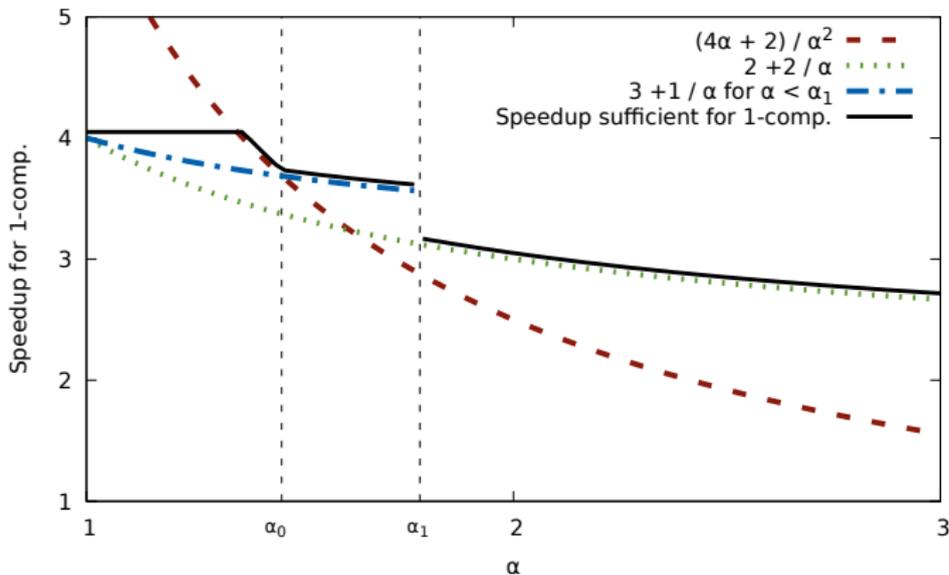
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Well-separated instances:

- $l_{i+1} \geq \alpha l_i$  for some parameter  $\alpha > 1$
- Our algorithm is 1-competitive with speedup  $S_\alpha$ :



# Algorithm for divisible instances

**Start phase** Run packet of the largest size  $l_j$  such that  $P^{<j} < l_j$ ,  
 $P^{<j}$ : total size of pending packets smaller than  $l_j$ .

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## Results using local analysis

- 2-competitive (optimal),
- 1-competitive with speedup 2 (optimal),
- both algorithmic results also done by [\[Jurdzinski et al.\]](#)