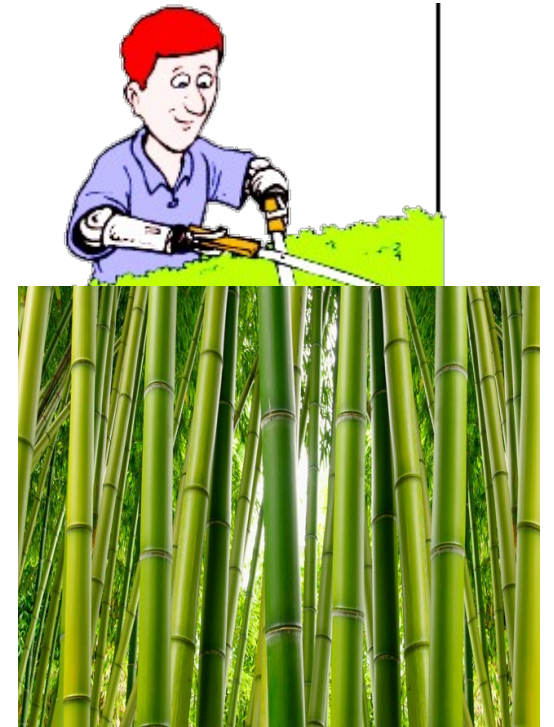


# Bamboo Garden Trimming Problem

Ralf Klasing, CNRS - LaBRI - Univ. of Bordeaux

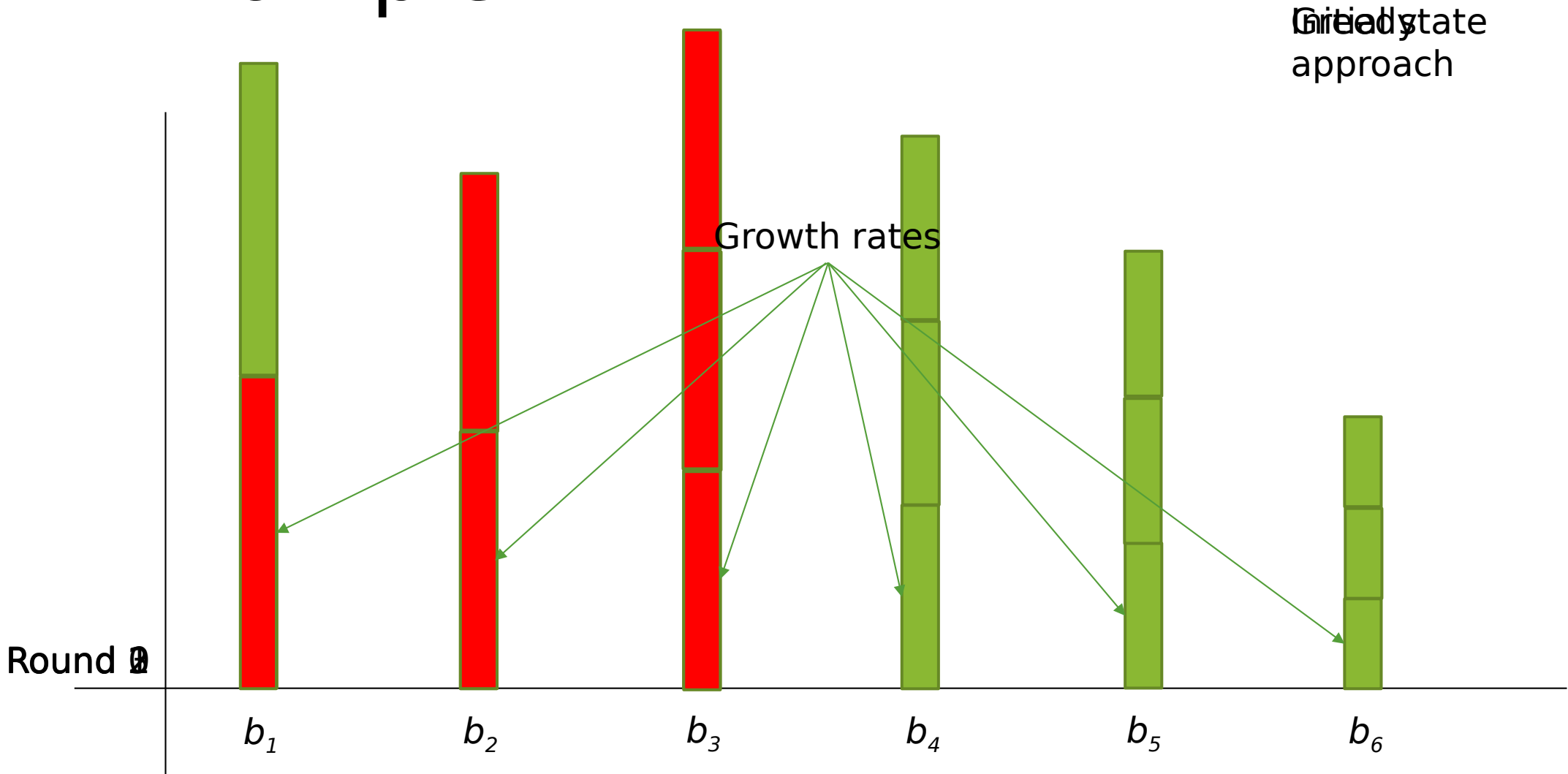
Joint work with Leszek A Gąsieniec, Christos Levcopoulos,  
Andrzej Lingas, Jie Min, and Tomasz Radzik

# Bamboo Garden Trimming



- Given a set  $B$  of  $n$  bamboos  $b_1, b_2, \dots, b_n$  with the respective (daily) growth rates  $h_1 \geq h_2 \geq \dots \geq h_n$ , where the initial heights of all bamboos are set to *zero*.
- **Discrete BGT**
  - During each round/day every bamboo  $b_i$  grows an extra height  $h_i$  and on the conclusion of the round the height of exactly one bamboo is reduced to *zero*.
- **Continuous BGT**
  - It requires time  $t_{ij} > 0$  for the gardener to move from  $b_i$  to  $b_j$  and the travel distances are symmetric.
  - When attended the bamboos are cut instantly.
  - **Note:** - Discrete BGT is a special case of Continuous BGT when  $t_{ij} = 1$  for all  $i, j$ 
    - Metric TSP is a special case of Continuous BGT when  $h_i = h_j$  for all  $i, j$
- The **main task** in **BGT Problem** is to find a perpetual schedule of cuts with the goal of keeping the height of the bamboo garden as low as possible.

# Example



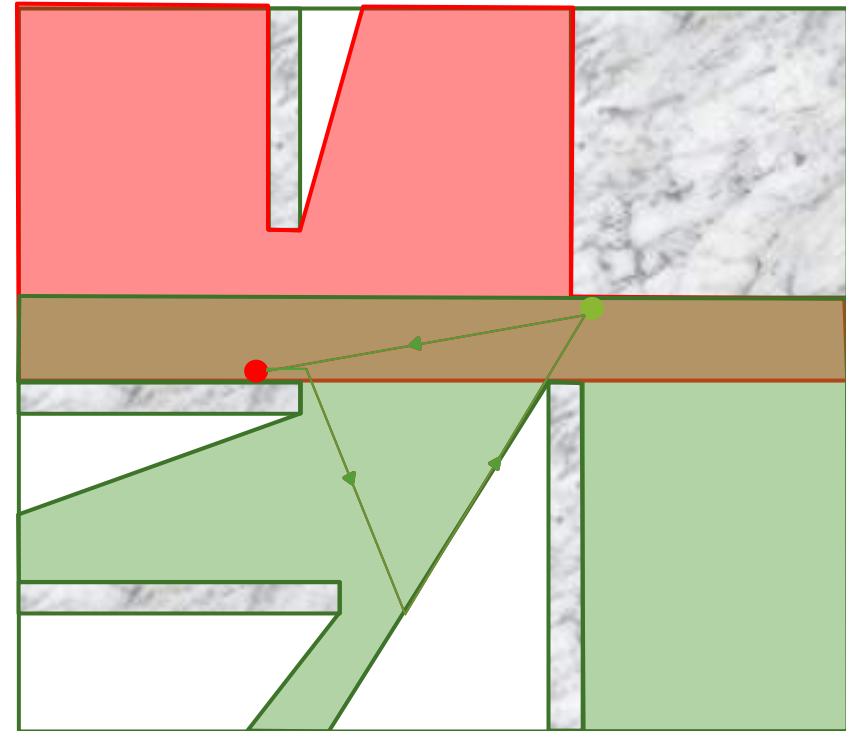
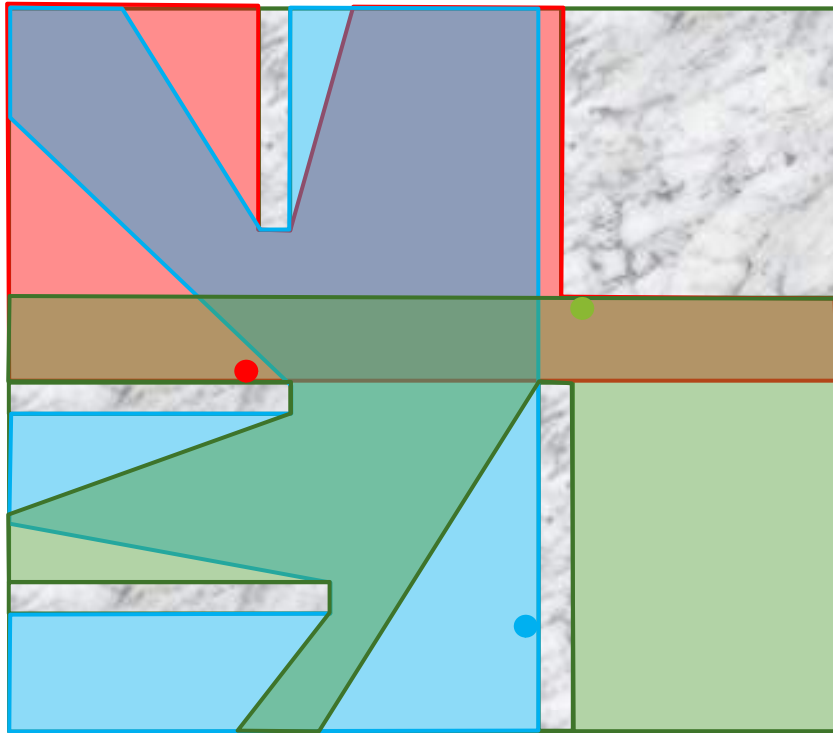
# The main results

Algorithms	Approximation ratio	Time complexity in #steps
<b>Discrete BGT</b>		
Reduce-Max (Greedy approach)	$O(\log_2 n)$	$O(n \log n)$ + each round in $O(\log^2 n)$
Reduce-Fastest	4	$O(n \log n)$ + each round in $O(\log n)$
Reduce-to-Pinwheel	2 1+ $\delta$ , balanced instances	$O(n)$ + each round in $O(1)$ $O(n \log n)$ + each round in $O(\log n)$
<b>Continuous BGT</b>		
Algorithm 1	$O\left(\frac{h_1}{h_n}\right)$	Generation of MST $O(n^2)$ + each round in $O(1)$
Algorithm 2	$O\left(\log_2 \frac{h_1}{h_n}\right)$	Partition $O(n)$ + Generation of MST $O(n^2)$
Algorithm 3	$O(\log_2 n)$	Partition $O(n)$ + Generation of MST $O(n^2)$

**Note:** We do not know whether BGT is tractable, similarly to closely related Pinwheel scheduling studied for years

# Research context

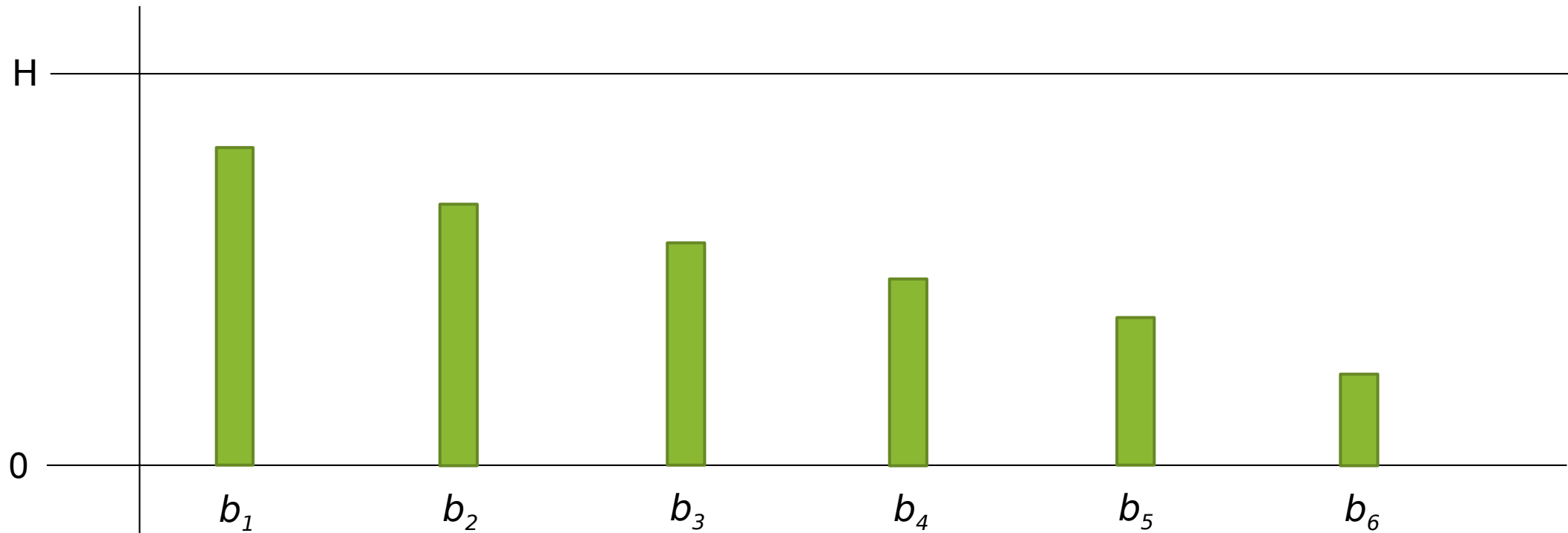
- The Art Gallery Problem



- K-watchman Problem
- Boundary (Fence) Patrolling Problem
- Cloud computing
  - Symptom discovery, origin of our problem
- Pinwheel problem (to be discussed later)

# Discrete BGT: Important lower bound $H$

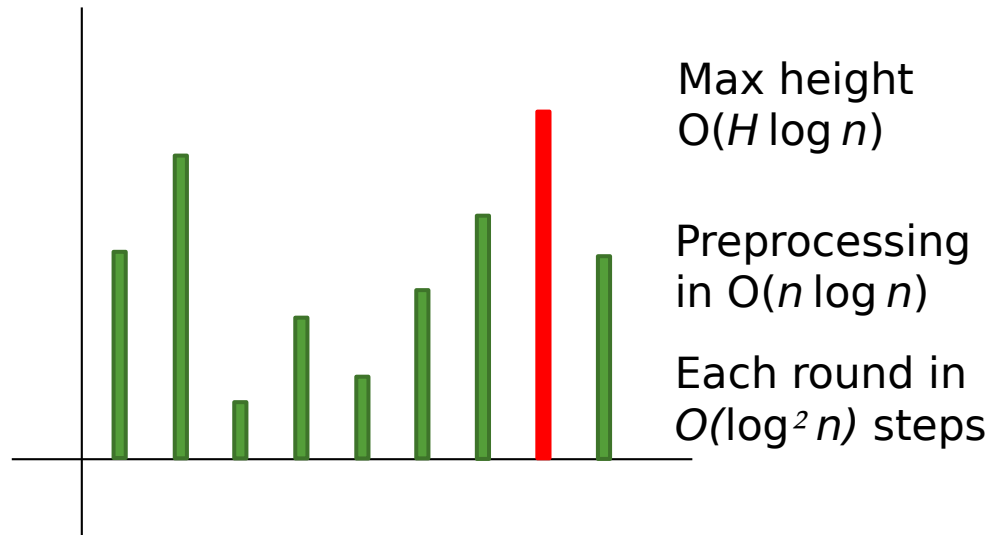
- Max height cannot be kept below  $H = h_1 + h_2 + \dots + h_n$ , i.e., a single **round contribution**  
*[The argument is based on the total height which keeps increasing when the cuts are  $< H$ .]*



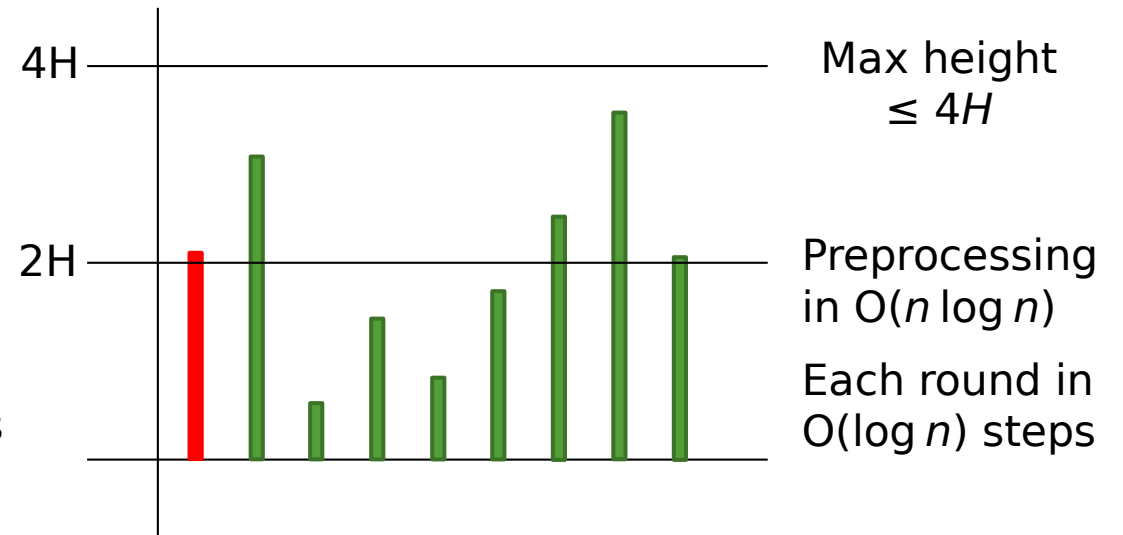
# Discrete BGT

- **Online**: memoryless, flexible (fault-tolerant, self-stabilising), harder to analyse

- *Reduce-Max* (Greedy 1)



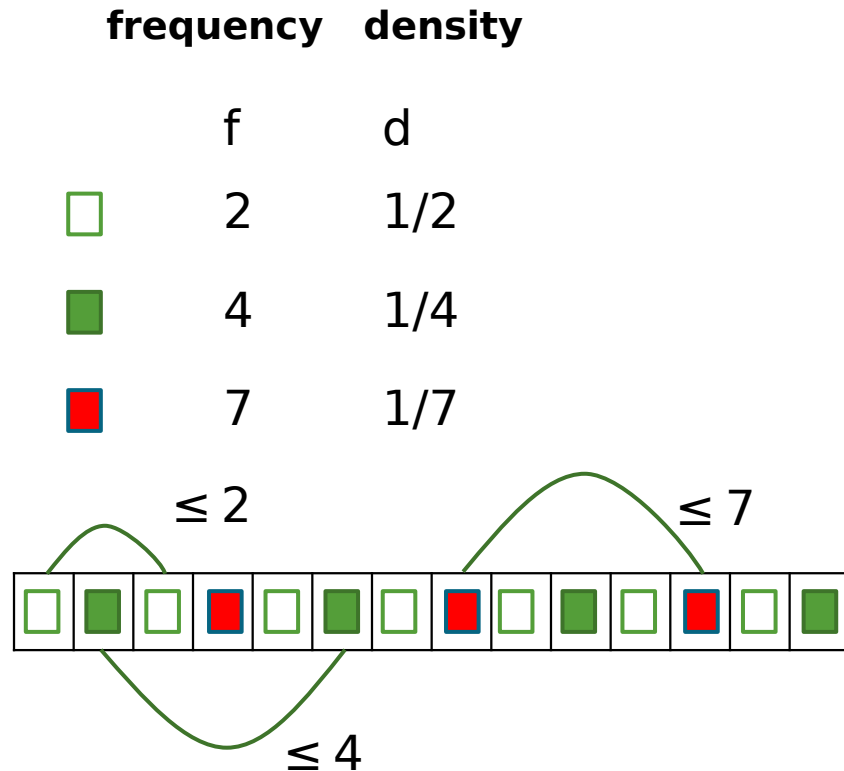
- *Reduce-Fastest* (Greedy 2)



- Approximation ratio  $\mu$  defined as  $Maxheight / H$
- Until recently  $\mu = O(\log n)$  for *Reduce-Max* and  $\mu = O(1)$  for *Reduce-Fastest*

# Discrete BGT

- **Offline**: less flexible (vulnerable to changes), better (more accurate) approximation  $\mu$
- Strong relation to the **Pinwheel Problem** (classical scheduling problem)



**Density** of the instance  
 $D = 1/2 + 1/4 + 1/7 = \mathbf{25/28}$

**Basic facts:**

$D > 1$ , not schedulable

$D \leq 1/2$ , easy to schedule

$D \leq 3/4$ , sometimes hard to schedule

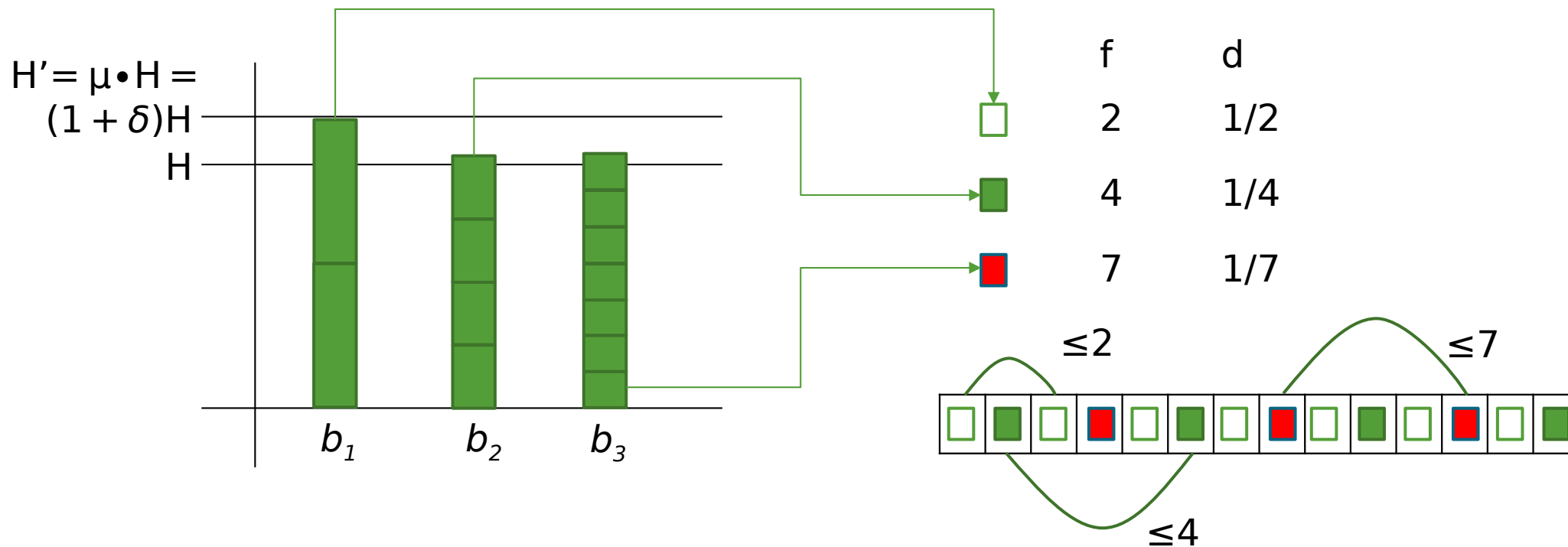
$D = 1$ , easy to schedule if all  $f$ s are powers of 2

$D > 5/6$ , not schedulable for, e.g.,  $f=2,3$ , large int.  $N$



# Discrete BGT

- Reduction to Pinwheel with density  $\leq 1$



## Comment:

By adopting  $\delta=1$  one can allow all frequencies  $f$  to be powers of 2. I.e.,  **$\mu=2$  approx. is always feasible**

# Discrete BGT ( $\mu = 1 + \delta$ , balanced instances)

- Idea:

- derive an appropriate powers-of two instance by gradual transformations of the Pinwheel instances
- start with greater granularity of frequencies than powers of two

- Observation 1:

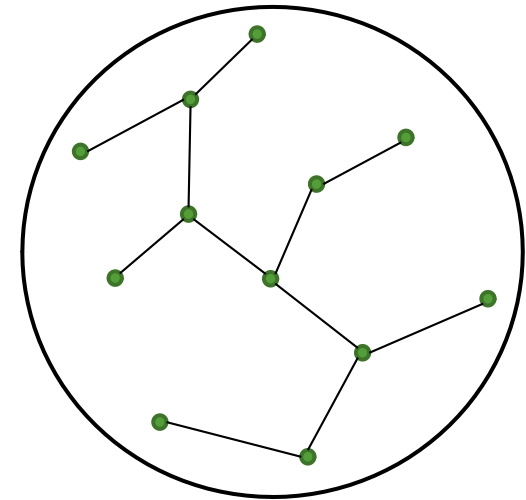
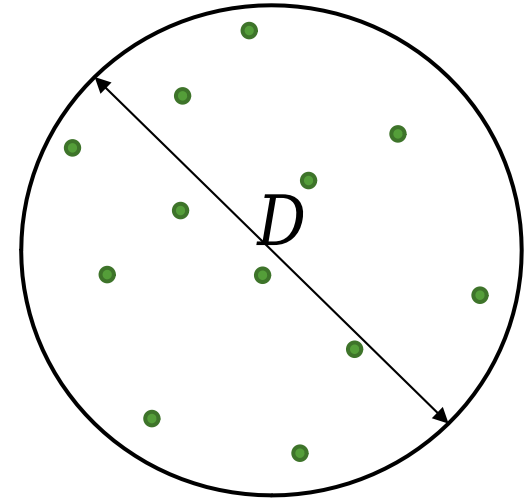
- Given instance  $V$  of Pinwheel with two equal frequencies  $f_i = f_j = 2f$  ( $f$  integer).
- If the instance  $V'$  obtained from  $V$  by replacing these two frequencies with one frequency  $f$  is feasible, then so is instance  $V$ .

- Observation 2:

- Given instance  $V$  with  $m$  equal frequencies  $f_{i,1} = f_{i,2} = \dots = f_{i,m} = mf$  ( $f$  integer).
- If the instance  $V'$  obtained from  $V$  by replacing these  $m$  frequencies with one frequency  $f$  is feasible, then so is instance  $V$ .

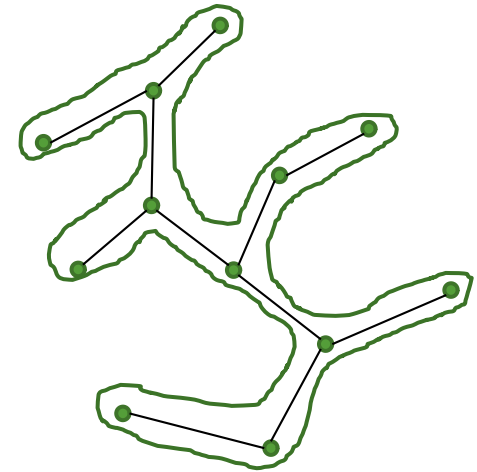
# Continuous BGT

- Differences to discrete BGT:
  - Bamboos are located in a (geo)metric space of diameter  $D$ .
  - For any pair of bamboos  $b_i$  and  $b_j$ , the gardener needs time  $t_{ij} > 0$  to travel from  $b_i$  to  $b_j$  and the travel distances are symmetric.
  - Each bamboo is cut instantly.
- Two natural lower bounds:
  - $D h_{max}(V)$
  - $h_{min}(V) MST(V)$



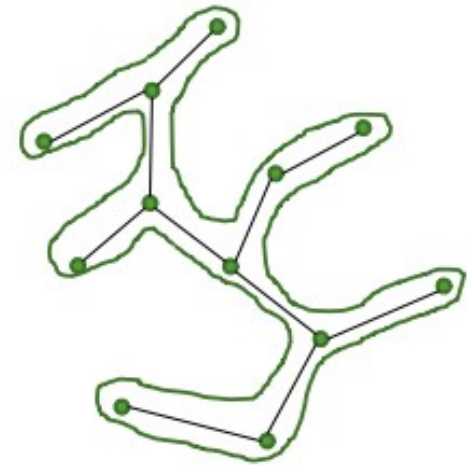
# Continuous BGT

- Algorithm 1
  - Calculate a minimum spanning tree  $T$  of the bamboos.
  - Repeatedly perform an Euler-tour traversal of  $T$ .
- Upper bound:  $O(h_{max}(V) MST(V))$



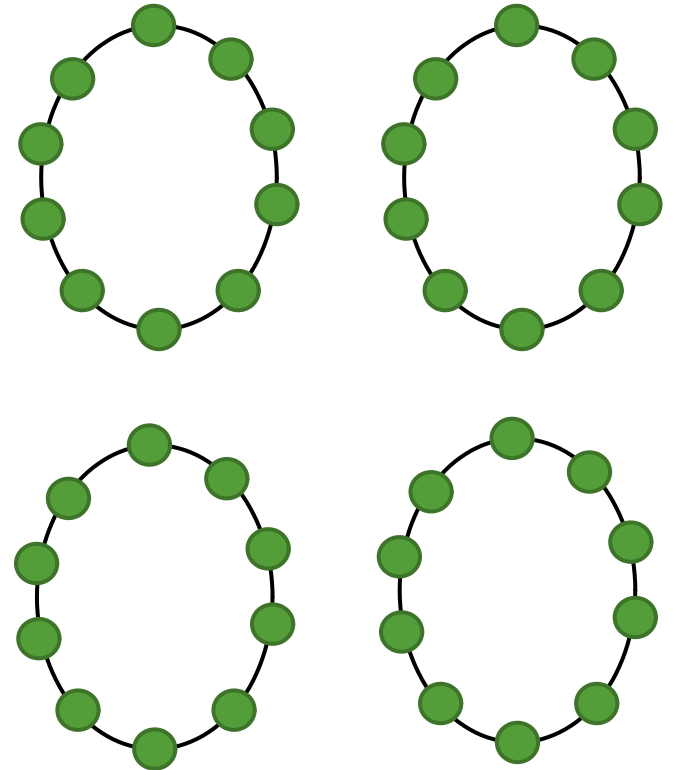
# Continuous BGT

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  - Repeatedly perform an Euler-tour traversal of  $T$ .
- Upper bound:  $O(h_{max}(V) MST(V))$
- Approximation ratio:  $O(h_{max}(V) / h_{min}(V))$



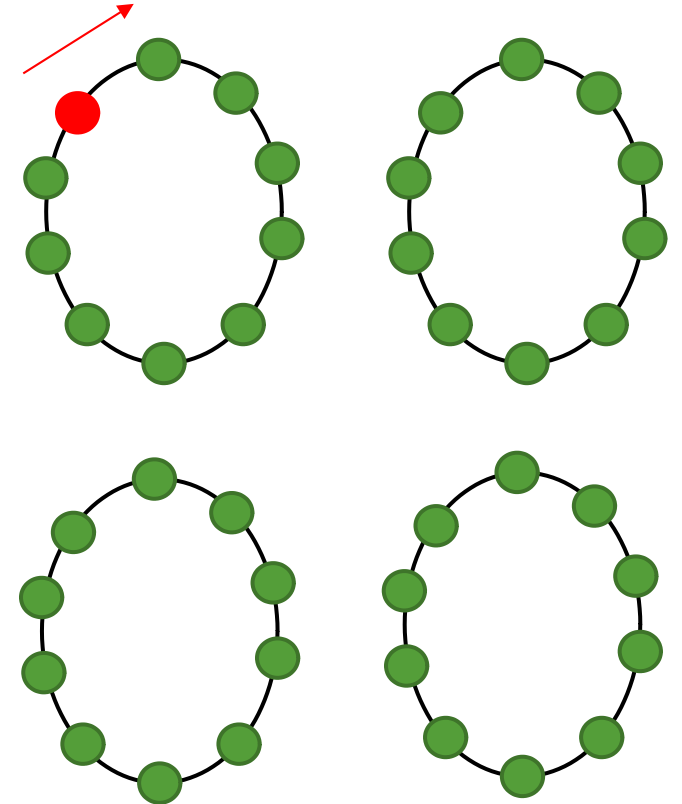
# Continuous BGT

- Algorithm 2
  - Partition bamboos into sets according to their growth rates.
    - $V_1: h_{min} \leq h_i < 2h_{min}$
    - $V_2: 2h_{min} \leq h_i < 4h_{min}$
    - ...
    - At most  $\left\lceil \log_2 \frac{h_{max}}{h_{min}} \right\rceil$  sets
  - Calculate a minimum spanning tree T of the bamboo sets.



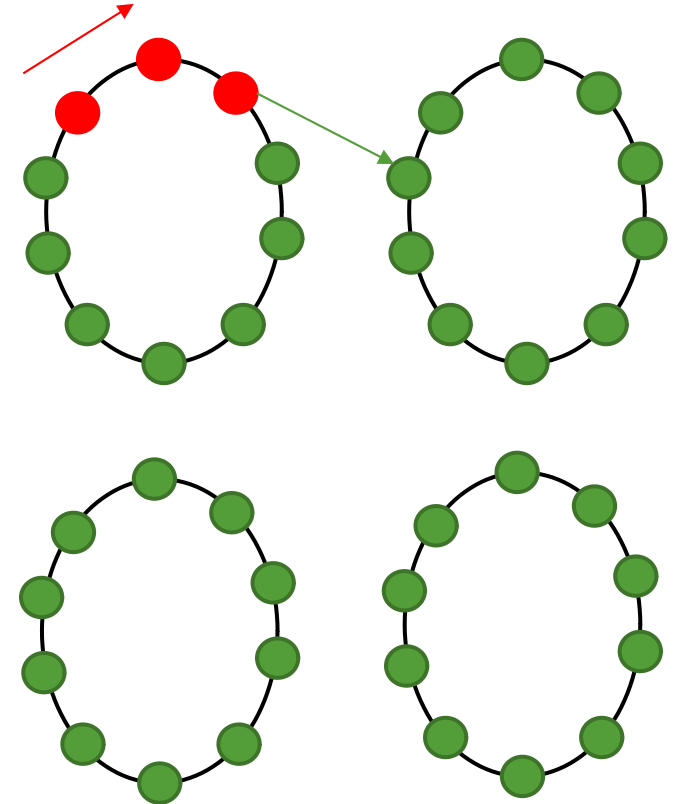
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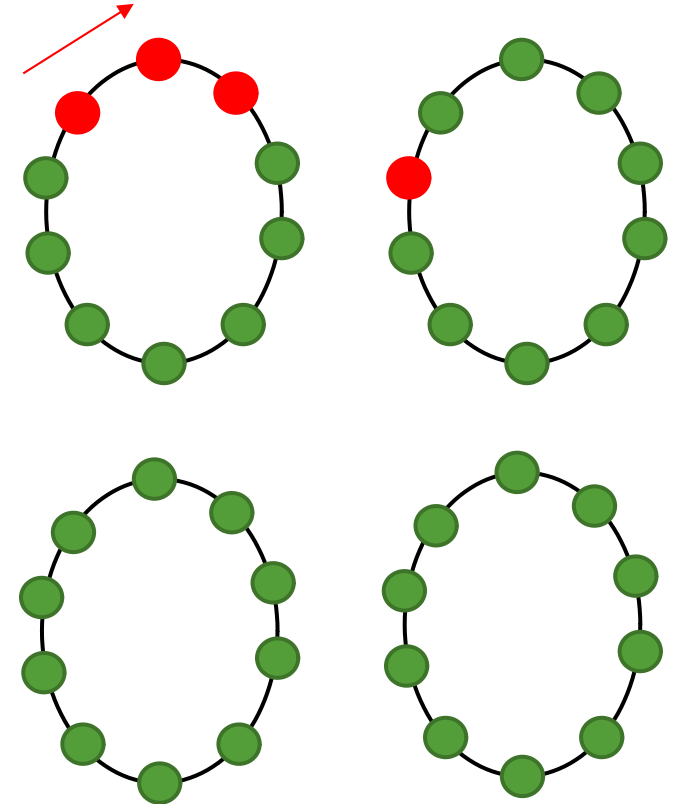
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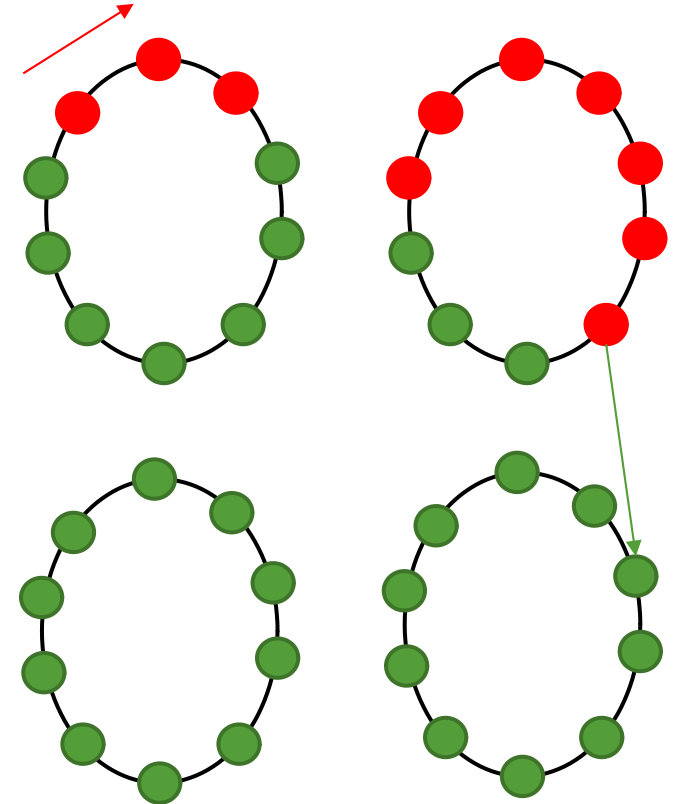
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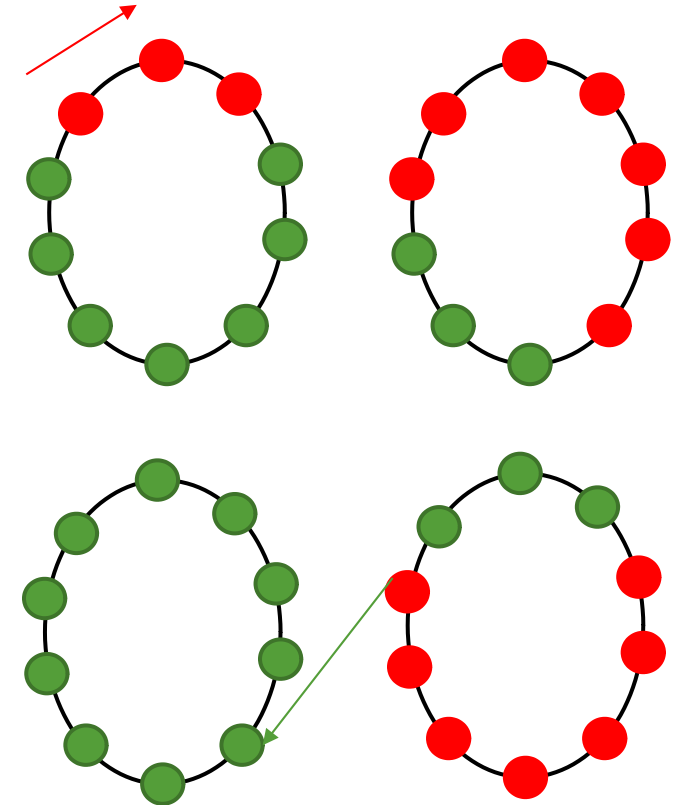
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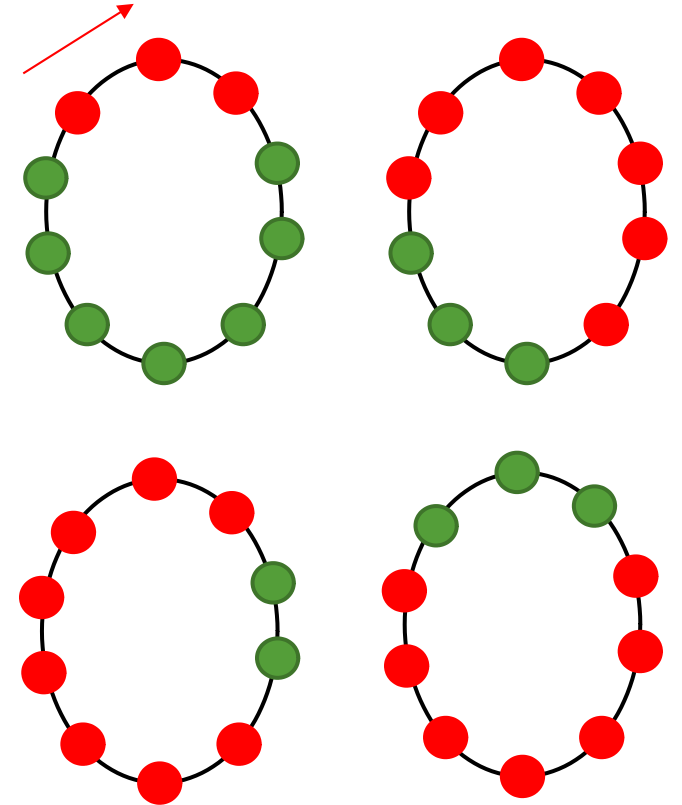
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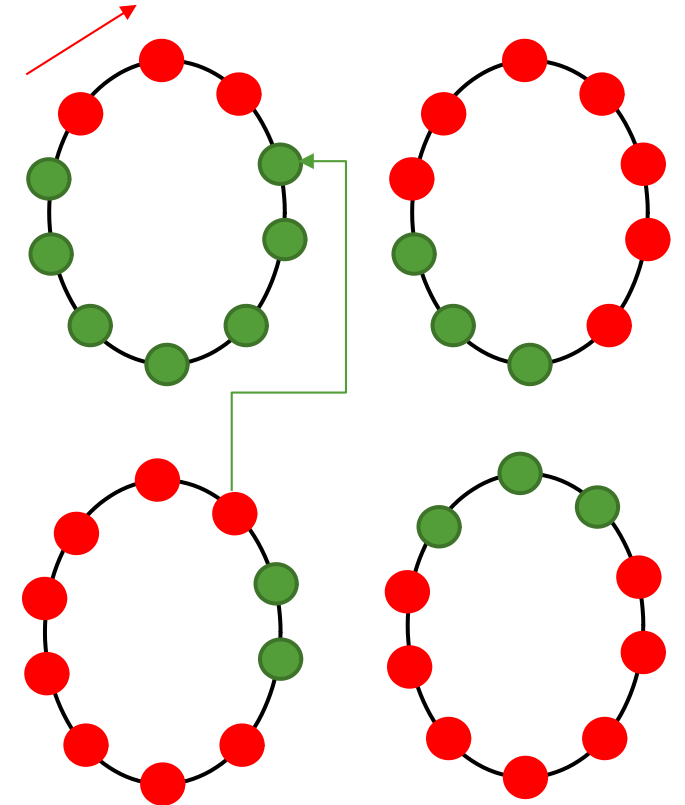
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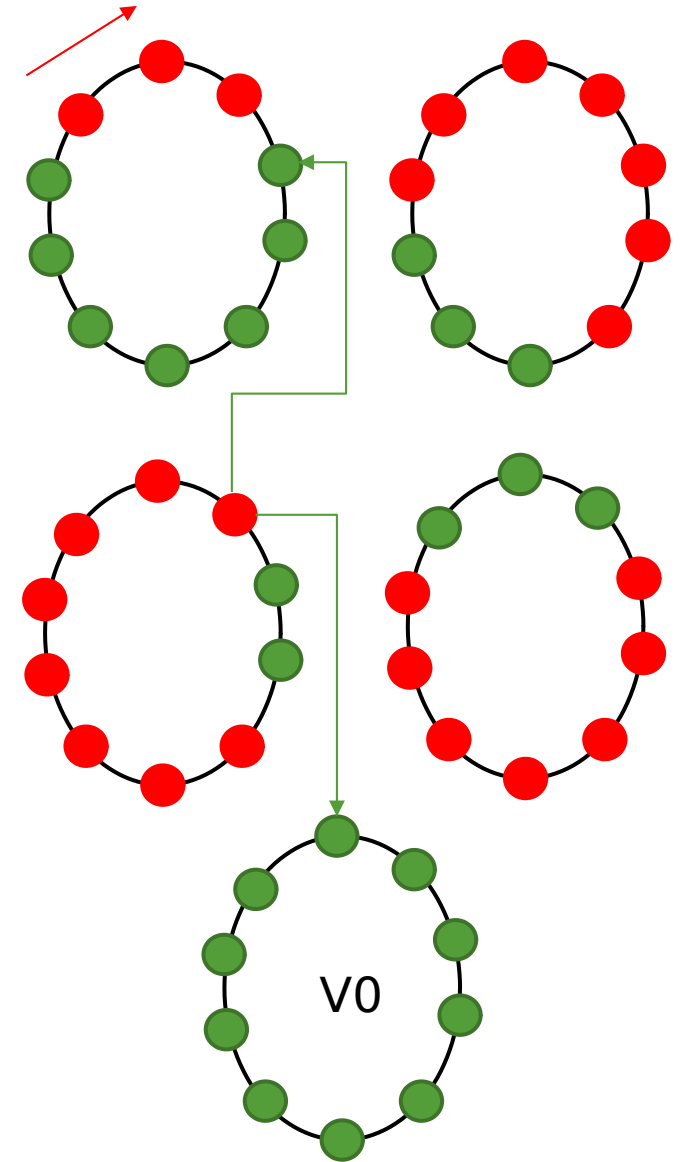
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    - ...
    - At most  $\left\lceil \log_2 \frac{h_{max}}{h_{min}} \right\rceil$  sets
  - Calculate a minimum spanning tree  $T$  of the bamboo sets.
- Upper bound:  $O\left(\log_2 \frac{h_{max}}{h_{min}} h_{max} (V_i) \max\{D, MST(V_i)\}\right)$
- Approximation ratio:  $O\left(\log_2 \frac{h_{max}}{h_{min}}\right)$



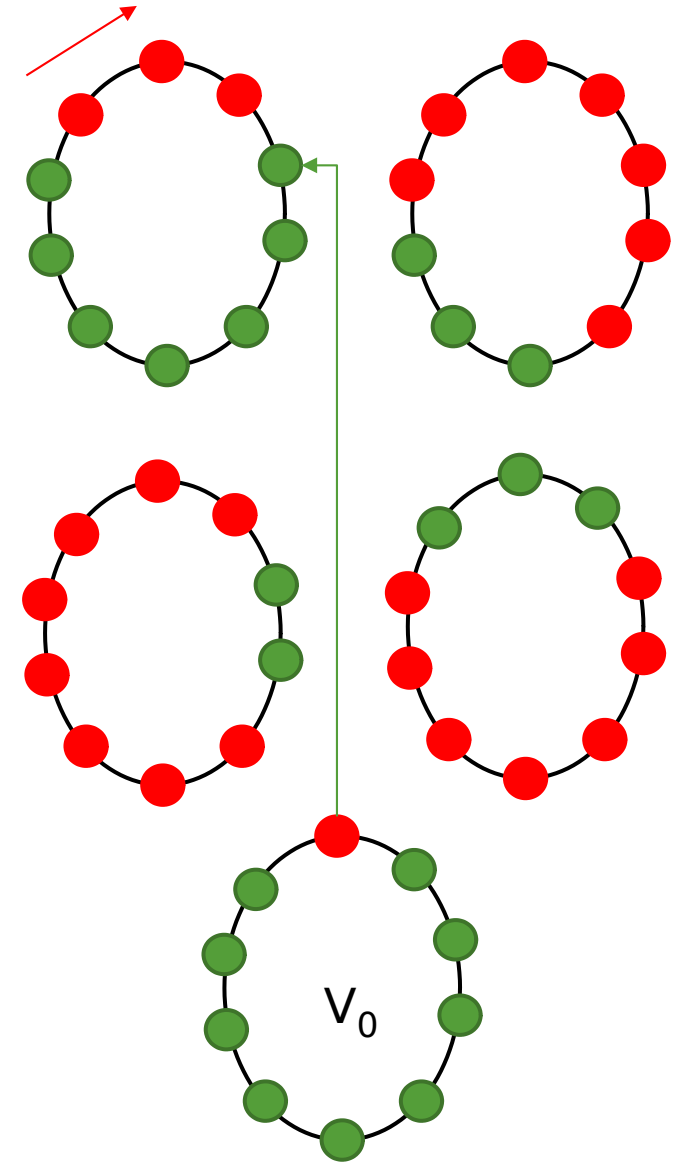
# Continuous BGT

- Algorithm 3
  - Different partitions.
    - $V_0: h_i \leq n^{-2}$
    - $V_1: n^{-2} < h_i \leq 2n^{-2}$
    - $V_2: 2n^{-2} < h_i \leq 4n^{-2}$
    - ...
  - At most  $\lceil 2 \log_2 n \rceil$  sets



# Continuous BGT

- Algorithm 3
  - Different partitions.
    - $V_0: h_i \leq n^{-2}$
    - $V_1: n^{-2} < h_i \leq 2n^{-2}$
    - $V_2: 2n^{-2} < h_i \leq 4n^{-2}$
    - ...
    - At most  $\lceil 2 \log_2 n \rceil$  sets
  - Upper bound:  $O(\log_2 n h_{\max}(V_i) \max\{D, MST(V_i)\})$
  - Upper bound of  $v_0$ :  $O\left(\frac{1}{n} D \log_2 n\right) = O(h_{\max} D \log_2 n)$
  - Approximation ratio:  $O(\log_2 n)$



# The main results

Algorithms	Approximation ratio	Time complexity in #steps
<b>Discrete BGT</b>		
Reduce-Max (Greedy approach)	$O(\log_2 n)$	$O(n \log n)$ + each round in $O(\log^2 n)$
Reduce-Fastest	4	$O(n \log n)$ + each round in $O(\log n)$
Reduce-to-Pinwheel	2	$O(n)$ + each round in $O(1)$
	$1+\delta$ , balanced instances	$O(n \log n)$ + each round in $O(\log n)$
<b>Continuous BGT</b>		
Algorithm 1	$O\left(\frac{h_1}{h_n}\right)$	Generation of MST $O(n^2)$ + each round in $O(1)$
Algorithm 2	$O\left(\log_2 \frac{h_1}{h_n}\right)$	Partition $O(n)$ + Generation of MST $O(n^2)$
Algorithm 3	$O(\log_2 n)$	Partition $O(n)$ + Generation of MST $O(n^2)$

**Note:** We do not know whether BGT is tractable, similarly to closely related Pinwheel scheduling studied for years



# Open Questions (Discrete BGT)

- Exact approximation ratios of *Reduce-Max* and *Reduce-Fastest*

Bilò et al. (2021):

- first constant upper bound of 9 for *Reduce-Max*
- improved upper bound of  $\approx 2.62$  for *Reduce-Fastest*

Simple examples: approximation ratios cannot be better than 2

- Improving the approximation ratio for arbitrary instances

Van Ee (2021):

- 2-approximation improved to  $12/7$ -approximation

# Open Questions (Discrete BGT)

- Designing efficient algorithms, easy to implement, avoiding reduction to Pinwheel

Bilò et al. (2021):

- 2-approximation
  - $O(n \log n)$  + each round in  $O(\log n)$  amortized time
- Lower bounds on approximability
  - Show hardness of discrete BGT problem + Pinwheel problem
  - Improving the approximation ratio for balanced instances

# Open Questions (Continuous BGT)

- Does Algorithm 3 have approximation ratio  $o(\log n)$ ?
- Is there any other algorithm with approximation ratio  $o(\log n)$ ?
  - discrete BGT and metric TSP (as two special cases of continuous BGT) are both approximable with approximation ratio  $O(1)$ .
  - It is NP-hard to approximate continuous BGT with a factor better than  $123/122$  (as Metric TSP is a subproblem of continuous BGT).
  - approximation ratio for geometric / Euclidean BGT instances?
- Multiple gardeners