# Balanced Structures and Scheduling Applications 

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LIG

## Sturmian Words: 3 equivalent definitions

Consider an infinite word:

## $00101001001010010100100 \ldots$

- minimal complexity : $n+1$ factors of length $n$. example: 4 factors of length 3: 001, 010, 100 and 101.
- balanced : number of 1 only differ by 1 in factors of same length.
- length 3: 1 or 2.
- length 4: 1 or 2.
- mechanical:
- for all $i: w_{i}=\lfloor\alpha(i+1)+\theta\rfloor-\lfloor\alpha i+\theta\rfloor$ or for all $i: w_{i}=\lceil\alpha(i+1)+\theta\rceil-\lceil\alpha i+\theta\rceil$


## Construction using a billiard sequence



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## Application to mapping

Consider a scheduling problem with two processors, one bag of tasks with stationary release times and stationary service times, independent of the release times.

A simple deterministic case is when the tasks are released at every time unit and the service times are $S^{1}$ and $S^{2}$ on both processors respectively (with $1 / S^{1}+1 / S^{2}>1$ ).
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The solution is given by a Sturmian sequence with density $\alpha=f\left(S^{1}, S^{2}\right)$. (Altman, G., Hordijk, 2001).

## Computing the optimal density



## Application to Polling

Consider a scheduling problem with one processor, two bags of tasks with stationary release times (common to the two bags of tasks) and stationary service times.

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Question: how to allocate the tasks to the processors in order to minimize the expected flow time?

## Problem

## Can we extend balancedness to trees?

- Sturmian
- balanced
- mechanical


## Previous Work

## Definition (Berstel, Boasson, Carton and Fagnot, 2007)

A Sturmian tree is a tree with $n+1$ subtrees of size $n$.

Simple example:


Example: The uniform tree corresponding to 0100101 ...

## Properties

- Link with language theory
- Interesting examples:


Example: Dyck Trees
But

- the balanced property is lost (important in optimization problems)
- no simple equivalent characterization


## Infinite Labeled Non-Planar Trees

Here, trees are:

- rooted

- labeled by 0 or 1
- infinite
- Non-ordered
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## What are Subtrees and Density?

We define:

- Factor of height $n$ (subtree).
- Factor of width $k$ and height $n$
- Density of a factor = average number of 1 .
- If $d_{n}$ is the density of the factor of height $n$ :

- density $=\lim _{n} d_{n}$
- average density $=$ $\lim _{n} \frac{1}{n} \sum_{k=1}^{n} d_{k}$


## First simple case

## What is a non-planar Rational Tree?

## Rational Trees: Definition

We call $P(n)=$ number of factors of size $n$.

Rational Trees: 3 equivalent definitions:

- $P(n)$ bounded.
- $\exists n / P(n)=P(n+1)$
- $\exists n / P(n) \leq n$.



## Rational Tree: average Density

## Theorem 1.

- A rational Tree has an average density $\alpha$ which is rational.
$\alpha$ is not necessarily a density but:
- If the associated Markov chain is aperiodic then $\alpha$ is a density.


## Example of density

- Periodic $=$ average density $d_{\text {average }}=\frac{1}{2}$

- Aperiodic : density $d=\frac{2}{9} \ell_{A}+\frac{1}{3} \ell_{B}+\frac{4}{9} \ell_{C}$



## Second case

## Balanced and Mechanical Trees

## Balanced Trees and Strongly Balanced Trees

- Balanced tree: number of 1 in factors of height $n$ only differ by 1 .
- Strongly balanced tree: same property with factors of height $n$ and width $k$.


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Example: Strongly balanced tree

## Density of a Balanced Tree

## Theorem 2.

- A balanced tree has a density.


## Sketch of the proof.

(1) A tree of size $n$ has a density $\alpha_{n}$ or $\alpha_{n}+\frac{1}{2^{n}-1}$


If blue has density $\alpha_{2}$ and red
$\alpha_{2}+\frac{1}{3}$ then $\alpha_{2} \leq \alpha_{4} \leq \alpha_{2}+\frac{1}{3}$
(3) Take limit

## Mechanical Trees

- Subtree of size $n$ has $2^{n}-1$ nodes.
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Mechanical tree of density $\alpha$ :

- For all node $i$, there is a phase $\phi_{i} \in[0 ; 1)$ such that the number of 1 in a subtree of height $n$ and root $i$ is $\left\lfloor\left(2^{n}-1\right) \alpha+\phi_{i}\right\rfloor$
(resp. for all i: $\left\lceil\left(2^{n}-1\right) \alpha+\phi_{i}\right\rceil$ )



## Uniqueness of a mechanical Tree

## Theorem 3.

- There exists a unique mechanical tree if $\left(\alpha, \phi_{0}\right)$ is fixed.

- The phase of the root $\phi_{0}$ is unique for almost all $\alpha$.


## Equivalences?

## What are the equivalences between definitions?

## Equivalences between Definitions

## Theorem 4: Mechanical ~ strongly balanced.

- A mechanical tree is strongly balanced
- A strongly balanced tree with irrational density is mechanical
- A strongly balanced tree with rational density is ultimately mechanical.


Example: Ultimately mechanical tree

## Sketch of Proof

## Mechanical implies strongly balanced.

The number of 1 in a factor of size $n$ and width $k$ is bounded by $\left\lfloor\left(2^{n}-2^{k}\right) \alpha\right\rfloor$ and $\left\lfloor\left(2^{n}-2^{k}\right) \alpha\right\rfloor+1$

## Strongly Balanced implies mechanical.

$\forall \tau \in[0 ; 1)$, if $h_{n}$ is the number of 1 in the subtree of size $n$, at least one of these properties is true:
(1) for all $n: h_{n} \leq\left\lfloor\left(2^{n}-1\right) \alpha+\tau\right\rfloor$,
(2) for all $n: h_{n} \geq\left\lfloor\left(2^{n}-1\right) \alpha+\tau\right\rfloor$.

Choose $\phi$ the maximal $\tau$ such that 1 is true.

## Theorem 5.

- An irrational mechanical tree is a Sturmian tree: it has $n+1$ subtrees of height $n$.


## Proof.

- A subtree of size $n$ depends only on its phase
- In fact, it depends on $\left(\left(2^{1}-1\right) \alpha+\phi, \ldots,\left(2^{n}-1\right) \alpha+\phi\right)$ which takes $n+1$ values when $\phi \in[0 ; 1)$.


## Limit of the Equivalences

- Balanced $\nRightarrow$ strongly balanced (no matter whether the density is rational or not).
- Sturmian $\nRightarrow$ balanced.
- Irrational Balanced tree $\nRightarrow$ Sturmian.

Example: Balanced tree not str.
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Example: Balanced tree non Sturmian

## Optimization Issues

Let $g: \mathbb{R}^{+} \rightarrow \mathbb{R}^{+}$be a convex function. For each node $n$ and each height $k>0$, we define a cost $C_{[n, k]}$ :

$$
C_{[n, k]}=g\left(d\left(\mathcal{A}_{n, k}\right)\right)
$$

cost of order $k$ of the tree is:

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C_{k}=\limsup _{\ell \rightarrow \infty} \frac{\sum_{n \in \mathcal{A}_{0, \ell}} C_{[n, k]}}{2^{\ell}-1}
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If $g$ has a minimum in $\alpha, C_{k}$ is minimized when the number of 1 in a tree of height $k$ is between $\left\lfloor\alpha\left(2^{k}-1\right)\right\rfloor$ and $\left\lceil\alpha\left(2^{k}-1\right)\right\rceil$. That means that a balanced tree will minimize any increasing function of all $C_{k}$.

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This has potential applications in optimization problem in distributed systems with a binary causal structure.

## Conclusion

- Non-planar definition better?
- Constructive definition
- Strong inclusions
- Good characterization
but:
- What are exactly balanced trees?
- How many balanced trees of size $n$ ?

