

## A dynamical view on fair assignments

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INSTITUT
DERECHERCHE EN INIOORMATIOUE IOONDAMENTALE

## The chairman assignment problem



- We are given $k$ states which form a union.
- Every year a union chairman has to be selected.
- At any time the accumulated number of chairmen from each state has to be proportional to its weight.

How to get in an effective way a fair assignment?

## From assignments to symbolic discrepancy

Take an infinite word $u=\left(u_{n}\right)_{n}$ with values in a finite alphabet.
The frequency $\alpha_{a}$ of the letter $a$ in $u$ is defined as the following limit, if it exists

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\alpha_{a}=\lim _{n \rightarrow \infty} \frac{1}{n} \operatorname{Card}\left\{k, 0 \leq k \leq n-1, u_{k}=a\right\}
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Examples

$$
010010100100101001010 \cdots
$$

$010001000100100100001001010 \cdots$

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The discrepancy of $u=\left(u_{n}\right)_{n}$ is defined as

$$
\Delta_{\boldsymbol{\alpha}}(u)=\max _{a \in \mathcal{A}} \sup _{n \in \mathbb{N}}\left|\operatorname{Card}\left\{k, 0 \leq k \leq n-1, u_{k}=a\right\}-n \alpha_{a}\right|
$$

The discrepancy measures the difference between the accumulated number and the expected value.

## How small can the discrepancy be?

We are given a finite alphabet $\mathcal{A}$, and a vector $\boldsymbol{\alpha}$ of frequencies for the letters of $\mathcal{A}$.

Theorem [Meijer,Tijdeman] Let $d$ stand for the cardinality of $\mathcal{A}$. Let $d \geq 2$. One has

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D_{d}=\sup _{\alpha} \inf _{u} \Delta_{\alpha}(u)=1-\frac{1}{2 d-2} .
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$$
\text { When } d=2, D_{2}=1 / 2
$$

How to construct such sequences?

## The two-letter case

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Sturmian words are codings of trajectories of dynamical systems.

## A trajectory for a discrete-time dynamical system

We consider orbits/trajectories of points of $X$ under the action of the map $T: X \rightarrow X$

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\left\{T^{n} x \mid n \in \mathbb{N}\right\}
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## And a coding of a trajectory



The coding works as follows

$$
u_{n}=i \text { if and only if } T^{n}(x) \in P_{i}
$$

$$
u=\left(u_{n}\right)_{n}=12355421 \cdots
$$

## Symbolic codings of circle rotations

Sturmian words are codings of the orbits of the rotation

$$
R_{\alpha}: x \mapsto x+\alpha \bmod 1 \text { w.r.t. } 2 \text { intervals. }
$$



$$
u_{n}=i \text { iff } x+n \alpha \in I_{i} \text { mod. } 1
$$

## A natural measure of order: factor complexity

What kind of information can the dynamical viewpoint offer here?

$$
u=0100101 \underbrace{00} 10010100101001
$$

00 is a factor, 11 is not a factor

## A natural measure of order: factor complexity

What kind of information can the dynamical viewpoint offer here?

$$
u=01001010010010100101001 \cdots
$$

Does the factor 00 occur? Does it have a frequency? Does it have bounded discrepancy?


## A natural measure of order: factor complexity

What kind of information can the dynamical viewpoint offer here?


The factors of length $n$ of $u$ are in one-to-one correspondence with the $n+1$ intervals of $\mathbb{T}$ whose end-points are given by

$$
-k \alpha \bmod 1 \quad \text { for } 0 \leq k \leq n
$$

By uniform distribution of $(k \alpha)_{k}$ modulo 1 , the frequency of a factor $w$ of a Sturmian word is equal to the length of $I_{w}$.

## Fair assignments in general dimension

The best assignments for $d=2$ code the simplest (discrete-time) dynamical systems.

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- Given a frequency vector $\boldsymbol{\alpha}=\left(\alpha_{a}\right)_{a \in \mathcal{A}}, \mathrm{R}$. Tijdeman ('80) has given an algorithmic way, to construct a sequence $u$ with $\Delta_{\alpha}(u) \leq 1-\frac{1}{2 d-2}$.


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Theorem [B.-Carton-Chevallier-Steiner-Yassawi] Let $u$ be a Tijdeman sequence with a frequency vector $\boldsymbol{\alpha}$ which has rationally independent coordinates.
Then, the sequence $u$ has factor complexity of order $n^{d-1}$.
The sequence $u$ is a symbolic coding of a translation $R_{\alpha}$ via a partition of a fundamental domain of $\mathbb{T}^{d-1}$ into $d$ finite unions of polytopes such that $R_{\boldsymbol{\alpha}}$ is a translation by a vector on each of the polytopes.

## Evenly distributed sequences

Let $\boldsymbol{\alpha}=\left(\alpha_{1}, \cdots, \alpha_{d}\right) \in[0,1]^{d}$ such that $\sum_{i=1}^{d} \alpha_{i}=1$.
How to construct sequences $u$ over the alphabet $\{1,2, \cdots, d\}$ satisfying the following conditions

- the letter frequencies in $u$ are given by $\left(\alpha_{1}, \cdots, \alpha_{d}\right)$
- $u$ has discrepancy smaller than or equal to $D_{d}$
- $u$ has linear complexity function
- $u$ has bounded discrepancy for factors

Let us start from the dynamical system given by the translation $R_{\boldsymbol{\alpha}}: \mathbf{x} \mapsto \boldsymbol{x}+\boldsymbol{\alpha}$ modulo 1 . How to find a good partition?

## The ubiquitous Fibonacci word

Take the golden ratio $\alpha=\frac{\sqrt{5}+1}{2}$ and the dynamical system

$$
\begin{gathered}
x \mapsto x+\alpha \text { modulo } 1 \\
\alpha^{2}=\alpha+1 \leadsto \text { self-similarity }
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u=\lim _{n} U_{n} \text { with } U_{n+1}=U_{n} U_{n-1}, \quad U_{0}=1, \quad U_{1}=12
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& x \mapsto x+\alpha \text { modulo } 1 \\
& \alpha^{2}=\alpha+1 \sim \text { self-similarity } \leadsto \text { substitution }
\end{aligned}
$$

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## And the Fibonacci substitution

$$
\begin{gathered}
\sigma(u)=u \text { with } \sigma: 1 \mapsto 12,2 \mapsto 1 \\
u=\sigma^{\infty}(1)=121121211211212 \cdots
\end{gathered}
$$

Theorem The symbolic dynamical system $\left(X_{\sigma}, S\right)$ is isomorphic to the geometric dynamical system $\left(\mathbb{T}, R_{\frac{1+\sqrt{5}}{2}}\right)$ where $\mathbb{T}=\mathbb{R} / \mathbb{Z}$

## A few milestones

- 1898, Hadamard Geodesic flows on surfaces of negative curvature.
- 1912 Prouhet-Thue-Morse substitution $\sigma: a \mapsto a b, b \mapsto b a$
- 1940, Morse-Hedlund Symbolic dynamics.
- 30's Skolem-Mahler-Lech theorem and linear recurrences.
- 60's Tilings, substitutions and the domino problem.
- 1984 Quasicrystals, quasiperiodic order and the Pisot conjecture.
- 80's Rauzy fractal and Thurston's tile for the Tribonacci numeration.
- 80's Reachability problems and linear recurrences.
- 2023 The Einstein monotile.

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Discrepancy





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## Rauzy fractal

Consider the Tribonacci substitution

$$
\sigma: 1 \mapsto 12,2 \mapsto 13,3 \mapsto 1
$$

$121312112131212131211213 \cdots$
$\pi\left(\overrightarrow{e_{1}}+\overrightarrow{e_{2}}+\overrightarrow{e_{1}}+\overrightarrow{e_{3}}+\overrightarrow{e_{1}}+\overrightarrow{e_{2}}+\overrightarrow{e_{1}}+\cdots\right)$
 $\pi$ projection along the expanding eigenline onto the contracting plane of the incidence matrix of $M_{\sigma}$ $\pi\left(\overrightarrow{e_{3}}\right)$ $\pi\left(\overrightarrow{e_{2}}\right) \longleftrightarrow \pi\left(\overrightarrow{e_{1}}\right)$
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(C) Timo Jolivet

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## Pisot numbers, codings and fractals

$$
X^{3}=X^{2}+X+1
$$

$$
\sigma: 1 \mapsto 12,2 \mapsto 13,3 \mapsto 1
$$

Theorem [Rauzy'82] The symbolic dynamical system $\left(X_{\sigma}, S\right)$ is measure-theoretically isomorphic to the translation $R_{\beta}$ on the two-dimensional torus $\mathbb{T}^{2}$

$$
R_{\beta}: \mathbb{T}^{2} \rightarrow \mathbb{T}^{2}, x \mapsto x+\left(1 / \beta, 1 / \beta^{2}\right)
$$



## How to produce symbolic codings for translations

How to produce fair assignments for a given vector of letter frequencies $\boldsymbol{\alpha}$.

- We apply a multidimensional continued fraction algorithm that generates nonnegative matrices

$$
\boldsymbol{\alpha} \mapsto\left(M_{n}\right)_{n} \text { with } \quad \boldsymbol{\alpha} \in \cap_{n} M_{1} \cdots M_{n} \mathbb{R}_{+}^{d}
$$

- that generates in turn a sequence of substitutions
- and thus infinite words $u=\lim \sigma_{0} \cdots \sigma_{n}(a)$.


## Beyond the Pisot conjecture

Classical exponentially convergent multidimensional continued fraction algorithms generate faithful symbolic codings for translations on the torus.

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Classical exponentially convergent multidimensional continued fraction algorithms generate faithful symbolic codings for translations on the torus.

Theorem [B.-Steiner-Thuswaldner]
For almost every $\alpha \in[0,1]^{d}$, there exists a faithful symbolic coding for the translation $R_{\alpha}: x \mapsto x+\alpha$ modulo 1 having bounded discrepancy.

- with also bounded discrepancy for all factors (multiscale)


## Exponential convergence of continued fraction algorithms

According to recent numerical experiments, classical multidimensional continued fraction algorithms seem to cease to be exponentially convergent when the dimension increases.
[B.-Steiner-Thuswaldner]

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[B.-Steiner-Thuswaldner]
Brun algorithm

| $d$ | $\lambda_{2}\left(A_{B}\right)$ | $d$ | $\lambda_{2}\left(A_{B}\right)$ |  |
| :---: | :---: | :---: | :---: | :---: |
| 2 | -0.11216 | 7 | -0.01210 |  |
| 3 | -0.07189 | 8 | -0.00647 |  |
| 4 | -0.04651 | 9 | -0.00218 |  |
| 5 | -0.03051 | 10 | +0.00115 |  |
| 6 | -0.01974 | 11 | +0.00381 |  |

To be confirmed theoretically and numerically
How to design efficient continued fraction algorithms?

## What can infinite words represent?

Infinite words arise as codings of trajectories but there is more. A word can represent

- A predicate in some logic
- A characteristic function for a subset of integers
- The sequence of digits of a real number in some numeration system
- A quasicrystal
- A tiling
- The trace of the execution of an algorithm


## Reachability vs. statistical properties of orbits

- Ergodicity and long-term behavior: will a trajectory visit infinitely often a subregion and how long will it stay in this subregion?
- Model checking and reachability problems for linear dynamical systems. Will an orbit enter a given subregion of the space or even reach a given point?
[B.,Fijalkow,Karimov,Nosan,Ohlmann,Ouaknine,Pouly, Schmitz,Shirmohammadi,Vahanwala,Worrell,. . .]

