

# Measuring Information in Timed Languages

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# Credits

## People

EA, Aldric Degorre, Dominique Perrin, Nicolas Basset,  
and Romain Aïssat

## Papers

- CONCUR'09
- FORMATS'09
- Basset's Master Thesis
- FSTTCS'10
- FORMATS'11
- a submission to a conference
- but no journal paper yet

# Part I

## The context

# Outline

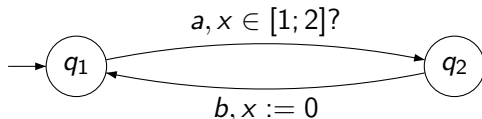
Timed languages

The Challenge

Classical case

## Reminder: Timed Languages and Timed Automata [Alur and Dill]

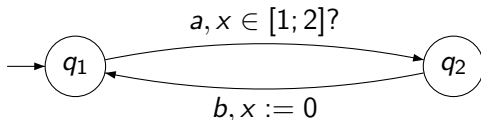
- Timed automaton (we forget to write  $\dot{x} = 1$ ):



- Anatomy: locations, clocks, transitions, labels, guards, resets
- States:  $(q, \mathbf{x})$  (infinite-state)

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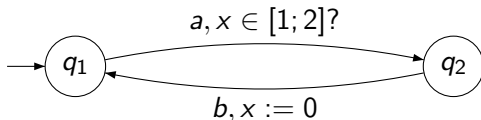


- Its run

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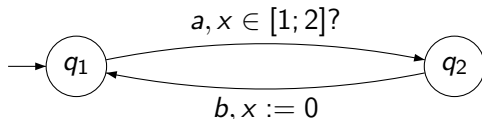
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- Its *trace*  $1.83 a 4.1 b 1 a \in \Sigma^3 \times \mathbb{R}^3$  *a timed word*

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- Its *trace*  $1.83 a 4.1 b 1 a \in \Sigma^3 \times \mathbb{R}^3$  a *timed word*
- Its *timed language*: set of all the traces starting in  $q_1$ , ending in  $q_2$ :

$$\{t_1 a s_1 b t_2 a s_2 b \dots t_n a \mid \forall i. t_i \in [1; 2]\}$$



## Some simple exercises

Draw timed automata for specifications:

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- Request  $a$  is serviced within 2 minutes by  $c$  or rejected within 1 minute by  $r$ .
- The same, but  $a$  arrives every 5 to 7 minutes.

# What I said 10 years ago

## From applied theory to basic theory - challenges

- Develop an algebraic theory of timed languages.
- Add topology and handle imprecision.
- Lift the classical theory: shuffle, determinizability, Kleene, logics, Myhill-Nerode, minimization, pumping
- Find new applications to timed texts: speech, music...

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But I missed one topic

Explore size and information measures of timed languages

# Why to Measure Size of Timed Languages

## Some reasons - speculations

- Mathematics: it is interesting, and generalizes classical notions
- Quantitative verification: size of bad behaviors
- Approximation quality for  $L \supset M$
- Information content: see below
- Security: timed information flow



# Reminder: Size of (Information in) Languages

## Defining entropy

- Take a prefix-closed language  $L \subset \Sigma^*$ .
- Count the words of length  $n$ : find  $\#L_n$
- Typically it grows exponentially
- Growth rate - entropy  $\mathcal{H}(L) = \limsup \frac{\log_2 \#L_n}{n}$

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## Explaining the definition

- Size measure:  $\#L_n \approx 2^{n\mathcal{H}}$ .
- Compression rate (in bits/symbol) for a typical  $w \in L$ , i.e.  $|w.zip| \approx \mathcal{H}|w|$
- Information content of a typical  $w \in L$  (bits/symbol)
- Topological entropy of a subshift.

# (explanation – compression rate vs $\mathcal{H}$ )

## Fact (Lower bound)

*Some word  $w \in L_n$  yields  $|w.zip| \geq \mathcal{H}n$*

## Proof.

There are  $2^m$  possible zip-files of size  $< m$ . If  $2^m < \#L_n$  then some  $w \in L_n$  has no zip of size  $< m$  . □

# (explanation – compression rate vs $\mathcal{H}$ )

## Fact (Lower bound)

*Some word  $w \in L_n$  yields  $|w.zip| \geq \mathcal{H}n$*

## Fact (Upper bound)

*For an appropriate compression algorithm  $|w.myzip| \leq \mathcal{H}n$*

## Proof.

Take  $w.myzip =$  the ordinal number of  $w$  (in binary) in lex. order of  $L_n$ . □

(explanation – compression rate vs  $\mathcal{H}$ )  
Kolmogorov complexity

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Corollary (Entropy = Information per symbol)

$$\max\{K(w) \mid w \in L_n\} \approx \mathcal{H}n$$

# Reminder: Entropy of Regular Languages

Computing  $\mathcal{H}(L(A))$  for a deterministic A

- Remove unreachable states
- Write down the adjacency matrix  $M$ .
- Compute  $\rho = \rho(M)$  - its spectral radius.
- Then  $\mathcal{H} = \log \rho$ .

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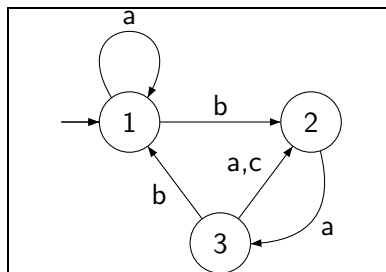
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- Remove unreachable states
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## Proof

- $\#L_n(i \rightarrow j) = M_{ij}^n$
- Hence  $\#L_n =$  sum of some elements of  $M^n$
- Perron-Frobenius theory of nonnegative matrices  
 $\Rightarrow \#L_n \approx \rho(M)^n \Rightarrow \mathcal{H}(L) = \log \rho(M)$

## Reminder: Entropy of Regular Languages - Example



$$M = \begin{pmatrix} 1 & 1 & 0 \\ 0 & 0 & 1 \\ 1 & 2 & 0 \end{pmatrix}$$

- Languages:  $\{\varepsilon\}$ ;  $\{a, b\}$ ;  $\{aa, ab, ba\}$ ;  $\{aaa, aab, aba, baa, bab, bac\}$ ;  $\{aaaa, aaab, aaba, abaa, abab, abac, baaa, bab, baca, baba, babb\} \dots$
- Cardinalities: 1, 2, 3, 6, 11, ...
- Spectral radius:  $\rho(M) \approx 1.80194$  (ugly cubic roots);  
entropy:  $\mathcal{H} = \log \rho(M) \approx 0.84955$ .



# Part II

## Quantitative theory of timed languages

# Outline

First Steps

Operator Approach

Discretization

Entropy = Information

# Towards Main Definitions for Timed Languages

## Observations about timed language

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- thus we can sum up volumes;
- this will give reasonable size measures.

# Main Definitions: Volume and Entropy

## Notations

- Given  $v = t_1 a_1 t_2 a_2 \dots t_n a_n$ , we write  $v = \mathbf{a} \otimes \mathbf{t}$ 
  - its *untiming*  $\mathbf{a} = a_1 a_2 \dots a_n$
  - its *timing*  $\mathbf{t} = t_1 t_2 \dots t_n$
- Volume of  $P \in \mathbb{R}^n$  denoted by  $\text{Vol}(P)$ .

## Definition (Volume and entropy of a timed language)

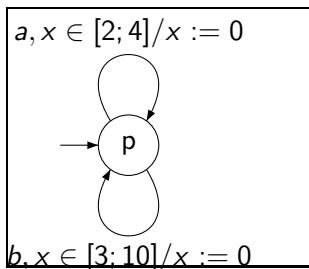
- Volume: sum up volumes of timings for all untimings

$$V_n(L) = \sum_{\mathbf{a} \in \Sigma^n} \text{Vol}\{\mathbf{t} \mid \mathbf{a} \otimes \mathbf{t} \in L\}$$

- Entropy: logarithmic growth rate of volume

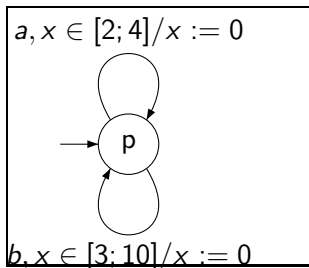
$$\mathcal{H}(L) = \limsup_{n \rightarrow \infty} \frac{\log_2 V_n}{n}.$$

## Example 1: Volume and Entropy



Language:  $L_1 = ([2; 4]a + [3; 10]b)^*$

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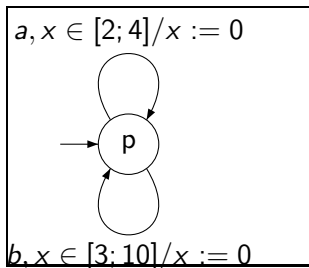


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- For the untiming  $bbab$  the set of timings is a rectangle  $[3; 10] \times [3; 10] \times [2; 4] \times [3; 10]$ , its volume  $7 \cdot 7 \cdot 2 \cdot 7 = 686$



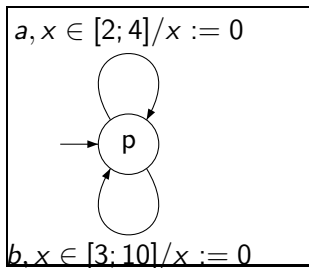
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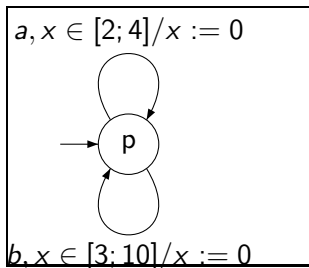
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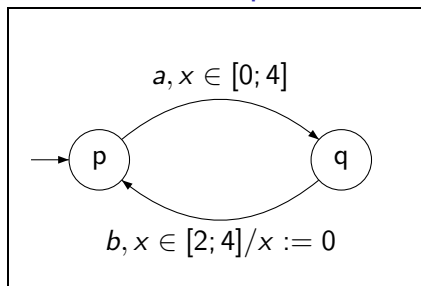
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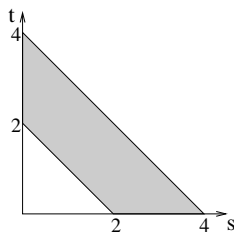
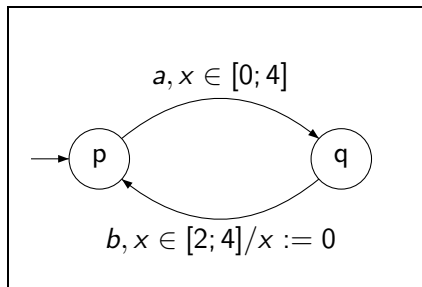
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- Entropy:  $\mathcal{H}(L_1) = \log 9 \approx 3.17$ .

## Example 2: Volume and Entropy



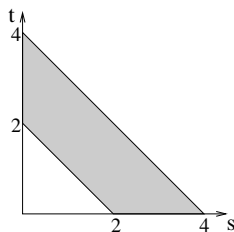
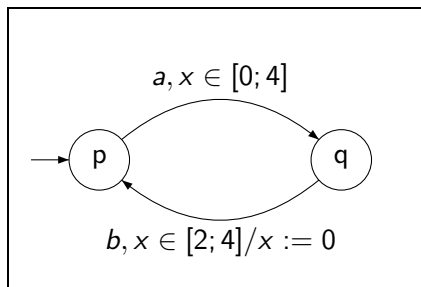
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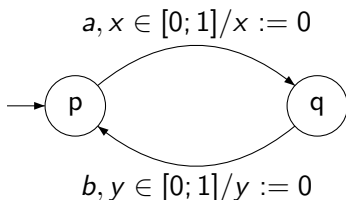
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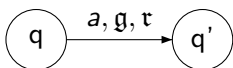
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- Entropy:  $\mathcal{H}(L_2) = \log 6/2 \approx 1.29$ .

## Example 3: Volume and Entropy



- Language:  $t_1 a t_2 b t_3 a t_4 b \dots$  such that  $t_i + t_{i+1} \in [0; 1]$
- For the only  $n$ -untiming  $w = (ab)^{n/2}$  the set of timings is a strange polyhedron.
- Volume: see below
- Entropy: see below

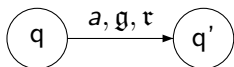
# Recurrence for Languages and Volumes



Let  $(q, x) \xrightarrow{\tau a} (q', x')$   
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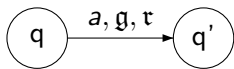
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Language recurrence

$$L_0(q, \mathbf{x}) = \varepsilon;$$

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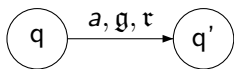
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Language recurrence (detailed)

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# Recurrence for Languages and Volumes



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 then  $u$  recognized from  $(q', \mathbf{x}') \Rightarrow$   
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We deduce the  $n$ -volume  $V_n = v_n(q_0, 0)$ , where:

Volume recurrence

$$v_0(q, \mathbf{x}) = 1;$$

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# First Theorem

## Theorem (Volume is computable)

$V_n$  is a rational number. It can be computed using the recurrence above.

## Example (Volume of $L_3$ )

The volume for our running example is

$$V_n(L_3) = \int_0^1 dt_1 \int_0^{1-t_1} dt_2 \int_0^{1-t_2} dt_3 \dots \int_0^{1-t_{n-1}} dt_n$$

That is

$$1; \frac{1}{2}; \frac{1}{3}; \frac{5}{24}; \frac{2}{15}; \frac{61}{720}; \frac{17}{315}; \frac{277}{8064}; \dots$$

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We have a beautiful formula for this sequence  
but the slide is too small (©Fermat).

# Reconsidering the Recurrence for Volumes

Recall the formula

$$v_0(q, \mathbf{x}) = 1;$$
$$v_{k+1}(q, \mathbf{x}) = \sum_{(q, a, g, \tau, q') \in \Delta} \int_{\tau: \mathbf{x} + \tau \in g} v_k(q', \tau(\mathbf{x} + \tau)) d\tau.$$

Volume recurrence – in 12 symbols

$$v_0 = 1;$$
$$v_{k+1} = \Psi v_k$$

with  $\Psi$  a positive linear operator on ...

# The Banach Space of a Timed Automaton

Defining a space where  $v_k$  lives, and  $\Psi$  acts.

## First attempt

$C(Q \times [0; M]^n)$ : continuous real-valued functions of  $(q, \mathbf{x})$   
(functions on the state space of  $A$ )

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## A better one

Let  $S = \{q\} \times r_q$  with  $r_q$  the entry region of  $q$ .  $\mathcal{F} = C(S)$   
(functions on the useful part of the state space of  $A$ )



# The Operator and its Properties

## The Operator

We know that

- $v_k = \Psi^k \mathbf{1}$
- Where  $\Psi : \mathcal{F} \rightarrow \mathcal{F}$
- $\Psi f(q, \mathbf{x}) = \sum_{(q,a,g,r,q') \in \Delta} \int_{\tau: \mathbf{x} + \tau \in g} f(q', \mathbf{r}(\mathbf{x} + \tau)) d\tau$

## Properties of $\Psi$

- A linear bounded positive operator (easy).
- $\Psi^k$  is compact (if every clock is reset every  $k$  steps).
- Perron-Frobenius theory applies.

# The Main Quantitative Theorem

## An explanation

- We know that  $v_k = \Psi^k \mathbf{1}$
- Perron-Frobenius says:  $\Psi^k v \sim \rho^k v^*$ , where  $\rho$  a spectral radius of  $\Psi$ , and  $v^*$  its eigenvector
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## Theorem (Entropy Theorem)

*For a deterministic (non-Zeno) timed automaton  $A$  the entropy of its language:*

$$\mathcal{H} = \log \rho(\Psi)$$

# Are We Done?

Yes – we have a characterization of the entropy.

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Yes – we have a characterization of the entropy.

No – it is rather implicit: we need the maximal  $\lambda$  s.t.

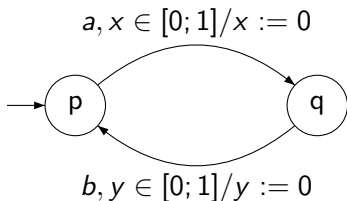
$$\Psi f = \lambda f$$

has a nontrivial solution.

An awful integral equation ...

How to get a number?

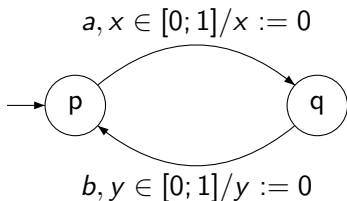
# The Easy Case: $1\frac{1}{2}$ Clocks



## Definition

TA is  $1\frac{1}{2}$  clocks  $\Leftrightarrow$  after every transition at most one clock  $\neq 0$ .

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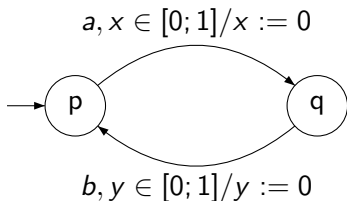


## Definition

TA is  $1\frac{1}{2}$  clocks  $\Leftrightarrow$  after every transition at most one clock  $\neq 0$ .

Then  $v(q, x)$  has 1-dim argument  $\Rightarrow$  all is easy.

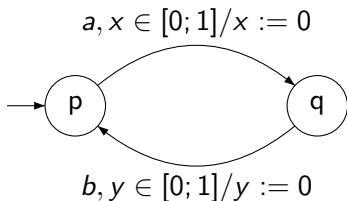
## Example: $1\frac{1}{2}$ Clocks



- The operator  $\Psi f(x) = \int_0^{1-x} f(s) ds$ .
- The integral equation  $\lambda v(x) = \int_0^{1-x} v(t) dt$

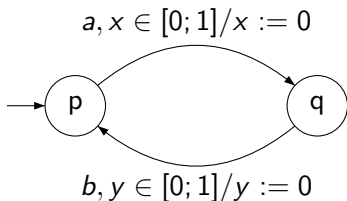


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## Example: $1\frac{1}{2}$ Clocks



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- The integral equation  $\lambda v(x) = \int_0^{1-x} v(t) dt$
- After derivation  $\lambda v'(x) = -v(1-x)$ . Still a problem.
- Once again  $\lambda^2 v''(x) = -v(x)$ . Also  $v(1) = 0, v'(0) = 0$
- Hence  $\lambda = 2/\pi; v(x) = \cos(\frac{x\pi}{2})$
- The entropy:  $\log(2/\pi) \approx -0.6515$

## The Procedure: $1\frac{1}{2}$ Clocks

1. Write the integral eigenvalue equation (I) with one variable.
2. Derivate (I) w.r.t.  $x$  and get a differential equation (D).
3. Instantiate (I) at 0, and obtain a boundary condition (B).
4. Solve (D) with boundary condition (B).
5. Take  $\rho = \max\{\lambda \mid \text{a non-0 solution exists}\}$ .
6. Return  $\mathcal{H}(L(A)) = \log \rho$ .

# Iteration Method for Positive Operators

## Theorem (Iteration)

*If  $\alpha v_m \leq v_{m+1} \leq \beta v_m$ , then  $\alpha \leq \rho \leq \beta$ .*

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## Method

To compute entropy

- Choose  $m$  and compute  $v_m$  and  $v_{m+1}$  (piecewise polynomial functions).
- Compute  $\alpha = \min(v_{m+1}/v_m)$  and  $\beta = \max(v_{m+1}/v_m)$ .
- Conclude that  $\mathcal{H} \in [\log \alpha; \log \beta]$ .

## Applying to the Running Example

For  $L_3$  the operator is:

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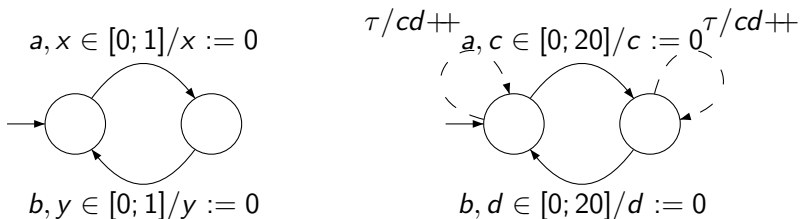
$m$	$v_m(x)$	$\alpha$	$\beta$	$\log \alpha$	$\log \beta$
0	1	0	1		
1	$1 - x$	0.5	1	-1	0
2	$1 - x - 1/2 (1 - x)^2$	0.5	0.667	-1	-0.584
3	$1/2 (1 - x) - 1/6 (1 - x)^3$	0.625	0.667	-0.679	-0.584
4	$1/3 (1 - x) + 1/24 (1 - x)^4 - 1/6 (1 - x)^3$	0.625	0.641	-0.679	-0.643
5	$\frac{5}{24} (1 - x) + \frac{1}{120} (1 - x)^5 - 1/12 (1 - x)^3$	0.6354	0.641	-0.6543	-0.643
6	$\frac{2}{15} (1 - x) - \frac{1}{720} (1 - x)^6 + \frac{1}{120} (1 - x)^5 - \frac{1}{18} (1 - x)^3$	0.6354	0.6371	-0.6543	-0.6506
7	$\frac{61}{720} (1 - x) - \frac{1}{5040} (1 - x)^7 + \frac{1}{240} (1 - x)^5 - \frac{5}{144} (1 - x)^3$	0.6364	0.6371	-0.6518	-0.6506

Conclusion:  $-0.6518 < \mathcal{H} < -0.6506$

# Discretizing Timed Automata

## Brute force approach - first steps

- Take a timed automaton  $A$ . Fix  $\varepsilon > 0$ .
- Replace every clock  $x$  by a counter  $c \approx x/\varepsilon$ .
- Add to every state a  $\tau, c++$ -loop (time progress  $\varepsilon$ ).
- Bounded counter automaton  $\rightarrow$  finite state automaton  $A^\varepsilon$ .
- $A^\varepsilon$  accepts the discretized language  $L^\varepsilon$  over  $\Sigma \cup \{\tau\}$ .





# Counting Words and Computing Entropy

- Let  $L_n^\varepsilon =$  all the words in  $L_\varepsilon$  with  $n$  events ( $\neq \tau$ ).
- Then  $L_n^\varepsilon$  is an  $\varepsilon$ -mesh in  $L_n$
- Hence  $\#L_n^\varepsilon \approx \text{Vol}(L_n)/\varepsilon^n$

## Theorem

### *Computing Entropy by Discretization*

$$\mathcal{H}(L) \approx \mathcal{H}(L^\varepsilon) + \log(\varepsilon)$$

with error bound  $O\left(\varepsilon^{1/3} \left(\log \frac{1}{\varepsilon}\right)^{2/3}\right)$

**Remark.** Don't forget to eliminate  $\tau$ s carefully.

# Kolmogorov Complexity of Timed Words and Timed Languages

## Preliminary considerations

Given a timed language  $L$

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## Definition

Maximal information content of  $n$ -event words in  $L$  up to  $\epsilon$

$$K(L, n, \epsilon) = \max_{w \in L} \min_{d(v, w) < \epsilon} K(v)$$

# Kolmogorov Complexity and Entropy

## Theorem

$$K(L, n, \epsilon) \approx n(\mathcal{H} - \log \epsilon)$$

## interpretation

Entropy = information per symbol.

# Part III

## Qualitative Theory

# Outline

Zeno phenomenon

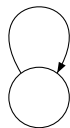
Thin-Thick alternative

Thick is nice



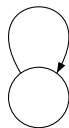
## Zeno vs non-Zeno timed automata

$$a, x \leq 1$$



- $(t_1, a)(t_2, a) \dots (t_n, a)$  with  $t_1 + \dots + t_n \leq 1$
- Arbitrary big number of events in bounded time.
- $t_n \rightarrow_{n \rightarrow +\infty} 0$
- No good discretization: No long words with delays  $t_i \in \epsilon \mathbb{N}_{>0}$ ,  $(t_1 + \dots + t_n > n\epsilon > 1)$ .

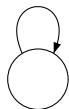
$$a, x \leq 1/x := 0$$



- $(t_1, a)(t_2, a) \dots (t_n, a)$  with  $t_1, \dots, t_n \leq 1$ .
- Duration of words are not bounded.
- Independent choice of delays  $t_1, \dots, t_n$ .
- Good discretization e.g.  $(0.6, a)^* \subseteq L$

# The simplex (Zeno and thin)

$$a, x \leq 1$$



Timed word:  $(t_1, a)(t_2, a) \dots (t_n, a)$

dimension 1



$$t_1 \leq 1$$

Volume 1

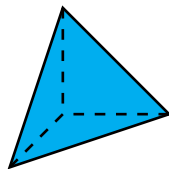
dimension 2



$$t_1 + t_2 \leq 1$$

Volume  $\frac{1}{2}$

dimension 3



$$t_1 + t_2 + t_3 \leq 1$$

Volume  $\frac{1}{6}$

dimension  $n$

?

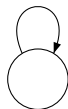
$$t_1 + \dots + t_n \leq 1$$

Volume  $\frac{1}{n!}$ ,

$\mathcal{H} = -\infty$ .

# The hypercube (non-Zeno and thick)

$$a, x \leq d/x := 0$$



Timed word:  $(t_1, a)(t_2, a) \dots (t_n, a)$

dimension 1



$$t_1 \leq d$$

Volume  $d$

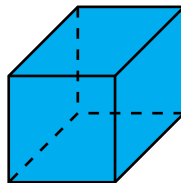
dimension 2



$$t_1, t_2 \leq d$$

Volume  $d^2$

dimension 3



$$t_1, t_2, t_3 \leq d$$

Volume  $d^3$

dimension  $n$

?

$$t_1, \dots, t_n \leq d$$

Volume  $d^n$ ,  
 $\mathcal{H} = \log d$

# Defining thin and thick

Recall  $\mathcal{H} = \lim \frac{1}{n} \log \text{Vol} L_n$ .

## Definition

Thin and thick

- Thin languages:  $\mathcal{H} = -\infty$  ( i.e.  $\text{Vol}(L_n) < \text{any exponent}$  )
- Thick languages:  $\mathcal{H} > -\infty$  (  $\text{Vol}(L_n) \approx \text{an exponent}$  )

## Example

Hypercube and simplex

- The simplex is thin ( $\frac{1}{n!}$  very small)
- The hypercube is thick ( $d^n$  an exponent)

# Thin and thick alternative - informally

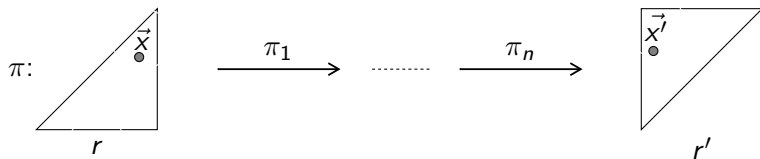
## Thin

- All behaviours are "bad".
- No good discretization.
- States move toward the border of guards.

## Thick

- Most of behaviours are "good".
- **Forgetfulness**: independence between beginning and end of a word.
- Pumping lemma.
- Good discretization.

## Reachability relation and forgetfulness



### Reachability relation along $\pi$

$$\text{Reach}(\pi) = \{(\vec{x}, \vec{x}') \mid \exists t_1 \dots t_n, \vec{x} \xrightarrow{(t_1, \pi_1)(t_2, \pi_2) \dots (t_n, \pi_n)} \vec{x}'\}$$

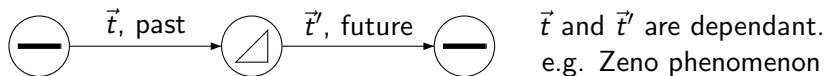
### Forgetful path

Forgetful path  $\pi$ :  $\text{Reach}(\pi) = \mathbf{r} \times \mathbf{r}'$ .

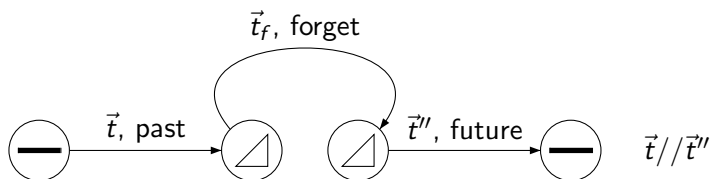
Ability to go from any state of  $\mathbf{r}$  to any of  $\mathbf{r}'$ .

Forgetful cycle:  $\mathbf{r}' = \mathbf{r}$

# Why forgetful?



Forget the past to build a new future!



# Main Qualitative Theorem

## Thin-Thick theorem

Equivalent definitions of thick languages:

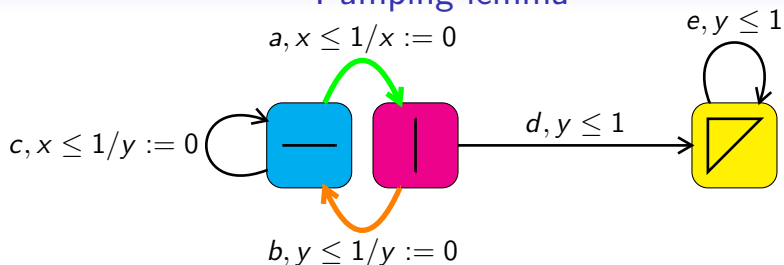
1.  $\mathcal{H} > -\infty$ ;
2. there exists a forgetful cycle;
3. there exists an  $\varepsilon$ -discrete strong limit cycle with  $\varepsilon > 0$ .

## The thin side (less formal)

1.  $\mathcal{H} = -\infty$ ;
2. dependance between beginning and end;
3. distance to border decreases, volume  $\sim 1/n!$ .



## Pumping lemma



### Discrete case pumping:

Every long word contains a pumpable cycle:  $uv^*w \in L$

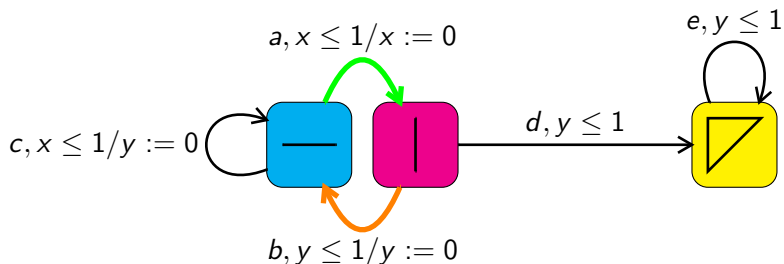
### Timed case - no pumping:

Some long word contain no pumpable cycle (no fixed timing for  $c$  in  $bc^*cadee$ )

### Timed thick case - no pumping:

Almost all long word contain a forgetful pumpable cycle (any timing for e.g.  $bcca$  in  $bccadee$ ).

## Thick path in thick automata



### thin and thick SCCs

$\mathcal{H}(\mathcal{A}) = \max \mathcal{H}(\mathcal{A}_i)$  with  $\mathcal{A}_i$  the SCCs of  $\mathcal{A}$

### Most of events of a thick path are in thick SCCs

Every long thick path spends more than 95% time in thick SCC.

# Part IV

## Conclusion

# Outline

Done

Being done

To do

# Summary

- Definition of volume and entropy
- Recurrent formula for volume
- A Banach space and an operator associated with a TA
- Entropy = log of its spectral radius
- A symbolic algorithm to compute  $\mathcal{H}$  for 1.5 clocks
- An iterative semi-numeric algorithm to compute  $\mathcal{H}$
- A brute force discretization algorithm to compute  $\mathcal{H}$  with error bounds.
- Links to Kolmogorov complexity of timed words
- $\mathcal{H} > -\infty \Rightarrow$  nice features of the automaton

# Ongoing Work

## We also have

- Link to dynamical systems, other entropies
- SCC decompositions
- A more precise entropy measure for punctual transitions.
- A rudimentary implementation.
- submitted: explicit formulas for volume sequences.

# Future Work

## We want

- An information theory for discrete/analog channels
- Error bounds/convergence proofs for operator methods
- Practical algorithmics
- Implementation
- Entropy per time unit.
- Applications