Automatic Synthesis of Systems with Data

Synthèse automatique de systèmes avec données

Léo Exibard Monday, September 20th, 2021

Introduction's Introduction

→ The introduction will be in French

Technical slides in English

https://cutt.ly/2EszvV5



Manuscript Introduction p. 24

https://cutt.ly/tEszWtP



These slides

https://cutt.ly/OEszRvM



Programmes

Programme : séquence d'instructions



Exemple: le tri par insertion

Entrée : Une liste d'entiers *L*

Résultat : La même liste, triée, T

 $T \leftarrow$ une liste vide

tant que L n'est pas vide faire

retirer le premier élément x de L parcourir la liste T (indice courant : i) dès que $x > T_i$, insérer x

fin

Méthodes formelles









- → Systèmes informatiques critiques
- → Nécessité d'en garantir le bon fonctionnement

Méthodes formelles









- → Systèmes informatiques critiques
- → Nécessité d'en garantir le bon fonctionnement avec une certitude *mathématique*

 \rightarrow Formalisation d'un « bon comportement »

Algorithme = comment Spécification = quoi

→ Formalisation d'un « bon comportement »

Algorithme = comment Spécification = quoi

Le tri

• Entrée : une liste d'entiers

• Sortie : la même liste, triée

ightarrow Formalisation d'un « bon comportement »

```
Algorithme = comment
Spécification = quoi
```

Le tri

- Entrée : $L \in \mathbb{N}^n$
- Sortie : $T \in \mathbb{N}^n$ telle que $\exists \sigma: \{1,\ldots,n\} \to \{1,\ldots,n\}$ bijective, $\sigma(L) = T$ et T est triée

→ Formalisation d'un « bon comportement »

```
Algorithme = comment
Spécification = quoi
```

Le tri

• Entrée : $L \in \mathbb{N}^n$

■ Sortie : $T \in \mathbb{N}^n$ telle que $\exists \sigma : \{1, \dots, n\} \rightarrow \{1, \dots, n\},$ $\forall 1 \leq j \leq n, \exists ! 1 \leq i \leq n, \sigma(i) = j \land \sigma(L) = T \land \forall 1 \leq i, j \leq n, O_i \leq O_i$

→ Formalisation d'un « bon comportement »

Algorithme = comment Spécification = quoi

Le tri

• Entrée : $L \in \mathbb{N}^n$

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→ L'algorithme de tri par insertion satisfait cette spécification

Vérification et synthèse

Entrées In Sorties Out

Programme (traite les entrées, produit des sorties) $P: In \rightarrow Out$

Environnement (fournit les entrées) $E: \rightarrow In$

Spécification (définit les entrées/sorties acceptables) $S \subseteq In \times Out$

Programme $P \parallel$ Environnement $E \models$ Spécification S

Vérification

Étant donnés P et S, vérifier que pour tout E, P satisfait S

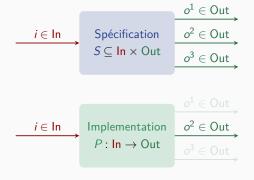
Synthèse

Étant donnée S, trouver P tel que pour tout E, P satisfait S

Synthèse

Entrées In

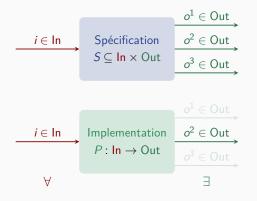
Sorties Out



Synthèse

Entrées In

Sorties Out



Le problème de la synthèse

Entrées In Sorties Out

S classe de spécifications $S \subseteq In \times Out$

 ${\mathcal I}$ classe d'implementations $P: {\sf In} \to {\sf Out}$

P satisfait S, noté $P \models S$, si pour tous $i \in In, (i, P(i)) \in S$

Problème de la synthèse pour ${\mathcal S}$ et ${\mathcal I}$

Entrée : $S \in S$

Sortie : \bullet $P \in \mathcal{I}$

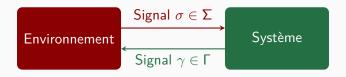
t. q. $P \models S$ si P existe

• Non sinon

La synthèse réactive

$$\mathsf{In} = \mathbf{\Sigma}^{\omega}$$
 $\mathsf{Out} = \mathsf{\Gamma}^{\omega}$

Les systèmes réactifs



Interaction $\rightsquigarrow \sigma_1 \gamma_1 \sigma_2 \gamma_2 \sigma_3 \gamma_3 \dots$

Spécification $S \subseteq (\Sigma \cdot \Gamma)^{\omega}$

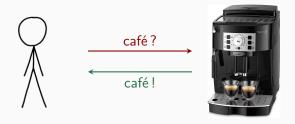
Implémentation = machine à états finis = système réactif

La synthèse réactive

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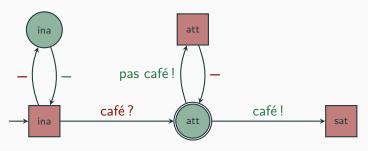
Spécification $S \subseteq (\Sigma \cdot \Gamma)^{\omega}$

Implémentation = machine à états finis = système réactif

Exemple

- Machine à café
- Chaque fois qu'un utilisateur commande un café, il doit finir par être satisfait
 - \rightarrow $G(req \Rightarrow F(grt))$

ω -Automates

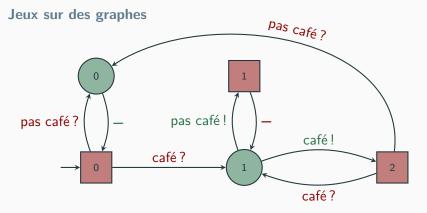


Un automate universel de co-Büchi vérifiant que chaque utilisateur finit par être satisfait.

q

Comment synthétiser un système réactif?

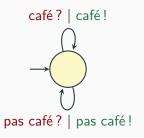
- → Construire un automate reconnaissant les exécutions correctes
- → Construire un jeu à deux joueurs à partir de l'automate
- → Stratégie gagnante ⇔ implémentation



Modèles pour les systèmes réactifs

Les stratégies gagnantes ont une mémoire finie

Transducteurs séquentiels



- Automates avec des sorties
- Produit de manière déterministe une lettre en lisant une lettre
- Tous les états sont acceptants

Limites

Observations

- → L'entrée et la sortie sont des ensembles finis
- → Les ensembles de grande taille sont difficiles à gérer

Retour à l'exemple

- Ensemble $C = \{1, \dots, n\}$ d'utilisateurs
- $\Sigma = \{ café?_1, \dots, café?_n, pas café? \}$ et $\Gamma = \{ café!_1, \dots, café!_n, pas café! \}$
- Désormais, chaque utilisateur a une requête spécifique
- Chaque commande de l'utilisateur *i* finit par être satisfaite :

$$igwedge_{1\leq i\leq n} G\Bigl(\mathsf{café?}_i
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Limites

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- → L'entrée et la sortie sont des ensembles finis
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$$igwedge_{1 \leq i \leq n} G\Big(\mathsf{café?}_i o F\big(\mathsf{café!}_i\big)\Big)$$

→ Nous considérons le cas où C est *infini* et doté d'une *structure*.

Quick recap

- Synthesis: generate a system from a specification
- Specification = MSO formula $\equiv \omega$ -automaton
- System = finite-state machine (transducer)
- Reactive synthesis is decidable for MSO specifications
- We aim at extending the result to infinite alphabets

Objectives of the thesis

Main goal

Lift existing synthesis techniques to infinite alphabets

- → Models for specifications and implementations
- → Decidability and complexity of synthesis procedures
- → Theoretical study of transducers over infinite alphabets

How to Represent Executions? Data Words

■ Data domain $\mathcal{D} = (\mathbb{D}, \mathfrak{R}, \mathfrak{C})$: infinite set of data with predicates and constants

$$\rightarrow$$
 e.g. $(\mathbb{N},=)$, $(\mathbb{Q},<)$, $(\mathbb{N},<,0)$

- Σ finite alphabet of *labels*
- Data words: sequences of pairs $(a, d) \in \Sigma \times \mathbb{D}$

- $\Sigma = \{ req, grt, \neg req, \neg grt \}$
- $\mathcal{D} = (\mathbb{N}, =)$

Extending Automata to Data Words

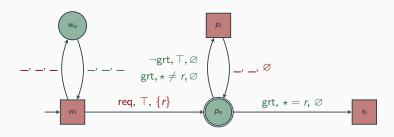
Register Automata (Kaminski and Francez 1994)

Finite automata with a finite set $q \xrightarrow{\sigma,\varphi,A} q'$

R of registers

- Store data
- Test register content

- $\sigma \in \Sigma$: label
- $\varphi \in \mathrm{QF}(R,\star)$: test
- $A \subseteq R$: assignment

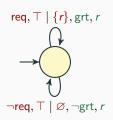


An URA checking that every request is eventually granted.

Synchronous Sequential Register Transducers

- Transitions $q \xrightarrow{i,\varphi} A,o,r q'$
 - *i* input letter, *o* output letter

 - A registers assigned ★
 - r register whose content is output
- Sequentiality: tests are mutually exclusive



A register transducer immediately satisfying each user.

Outline

Part I: Reactive Synthesis

- → Specifications: synchronous register automata
- → Implementations: synchronous sequential register transducers
- → Decidability border + compromise expressivity vs complexity

Part II: Computability

- → Specifications: non-deterministic asynchronous register transducers
- → Implementations: any algorithm
- → Theory of asynchronous register transducers

Reactive Synthesis over Data Words

Synthesis of Register Transducers

 \mathcal{S} : specification register automata

 \mathcal{I} : synchronous sequential register transducers

Unbounded Synthesis Problem

Input: *S* a register automaton

Output: • *M* a synchronous sequential register transducer

such that $M \models S$ if it exists

• No otherwise

Theorem

The unbounded synthesis problem is undecidable for S given as a Universal Register Automaton with ≥ 3 registers, already over $(\mathbb{D}, =)$.

Register-Bounded Synthesis of Register Transducers

 \mathcal{S} : specification register automata

 \mathcal{I} : synchronous sequential register transducers with k registers

Register-Bounded Synthesis Problem

Input: S a register automaton, k a number of registers

Output:

- M a synchronous sequential register transducer with k registers (and arbitrarily many states) such that $M \models S$ if it exists
- No otherwise

Theorem

The register-bounded synthesis problem for S given as a Universal Register Automaton is in 2-ExpTime over $(\mathbb{D},=)$ and $(\mathbb{Q},<)$.

The Case of Universal Specifications

Transfer Theorem

S is realisable by a sequential register transducer with k registers iff $W_{S,k} = \{\alpha \mid \mathsf{Comp}(\alpha) \subseteq S\}$ is realisable by a (register-free) sequential transducer.

→ $W_{S,k}$ is ω -regular for S URA

The Case of Universal Specifications

Transfer Theorem

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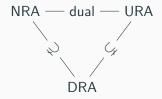
- → $W_{S,k}$ is ω -regular for S URA
- → Reduces to ω -regular synthesis

Theorem

The register-bounded synthesis problem for S given as a Universal Register Automaton is in 2-ExpTime over $(\mathbb{D}, =)$ and $(\mathbb{Q}, <)$.

Results

	URA	DRA	NRA	test-free NRA
Register-bounded synthesis	2ExpTime	2ExpTime	Undecidable $(k \ge 1)$	2ExpTime
Unbounded Synthesis	Undecidable	EXPTIME-c	Undecidable	Open



The Case of Deterministic Specifications: $(\mathbb{N}, <)$

Theorem

The unbounded synthesis problem for S given as a Deterministic Register Automaton over $(\mathbb{N}, <)$ is undecidable.

→ Simulate counting using antagonism between the players

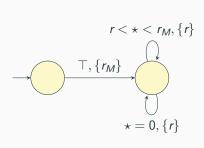
The Case of Deterministic Specifications: $(\mathbb{N}, <)$

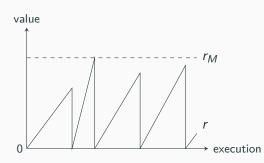
Theorem

The unbounded synthesis problem for S given as a Deterministic Register Automaton over $(\mathbb{N}, <)$ is undecidable.

→ Simulate counting using antagonism between the players

Non-regular behaviours





→ The set of feasible action words is not regular

The Case of Deterministic Specifications: $(\mathbb{N}, <)$

Theorem

The unbounded synthesis problem for S given as a one-sided Deterministic Register Automaton over $(\mathbb{N}, <)$ is ExpTime-c.

→ Target finite-memory implementations~→ regular approximation is enough.

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Summary

_		URA	DRA	NRA	test-free NRA
_	Register-bounded	2ExpTime	2ExpTime	Undecidable $(k \ge 1)$	2ExpTime
	synthesis				
	Unbounded	Undecidable	EXPTIME-c	Undecidable	Open
	Synthesis				

Decidability picture over $(\mathbb{D},=)$ and $(\mathbb{Q},<)$

- Generalises to oligomorphic data domains
- Over $(\mathbb{N}, <)$, only the unbounded synthesis for one-sided DRA is known to be decidable

Related publications

- E., Filiot and Reynier (CONCUR 2019 and LMCS 2021). "Synthesis of Data Word Transducers"
- E., Filiot and Khalimov (STACS 2021). "Church Synthesis on Register Automata over Linearly Ordered Data Domains"

Closely Related Works

Synthesis from register automata

- Khalimov, Maderbacher, and Bloem 2018
- Khalimov and Kupferman 2019
- Ehlers, Seshia, and Kress-Gazit 2014

Synthesis from automata with arithmetic Faran and Kupferman 2020

Synthesis from Logic of Repeating Values Figueira, Majumdar, and Praveen 2020

Synthesis over timed automata

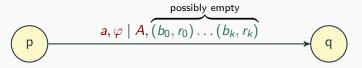
D'Souza and Madhusudan 2002

Computability over Data Words

Asynchronicity

- → It can be worth waiting for additional input before outputting something
- → Growing body of research on generalised transducers

Asynchronous Register Transducers

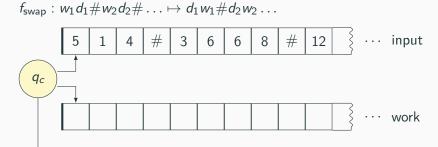


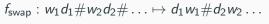
Asynchronicity

Theorem (Carayol and Löding 2015)

The synthesis problem from non-deterministic (register-free) asynchronous transducers to sequential ones is undecidable.

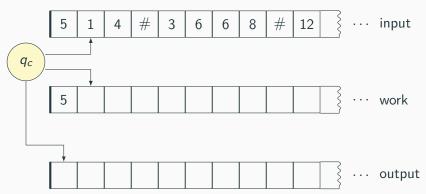
→ Relax finite-memory requirement \rightsquigarrow computable implementations.





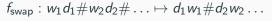




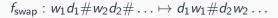


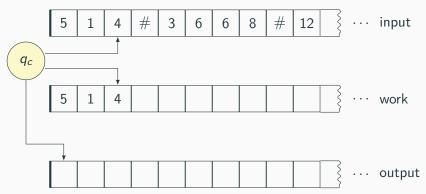


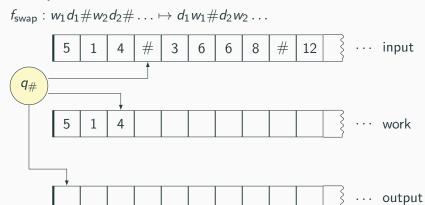


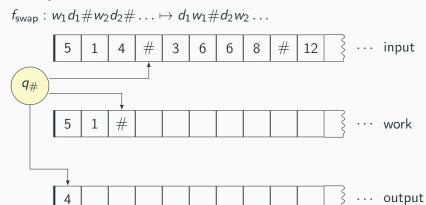




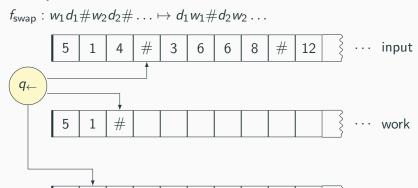




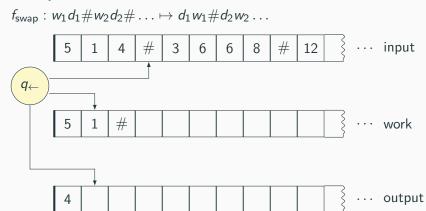


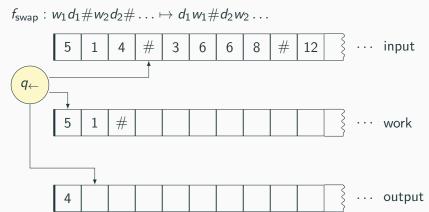


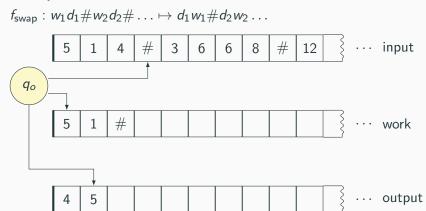
Example

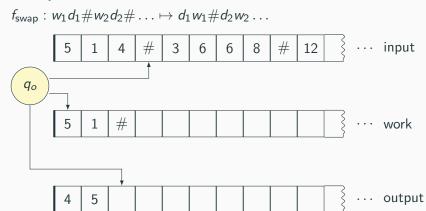


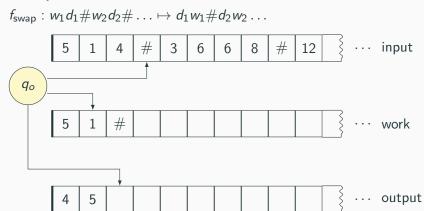
· · · output

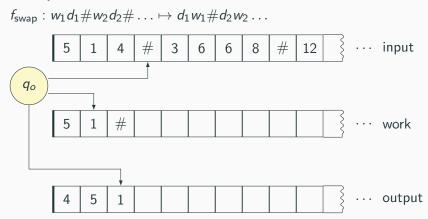


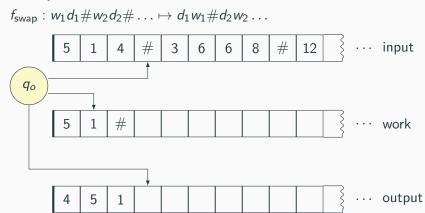


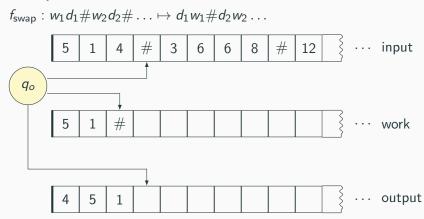


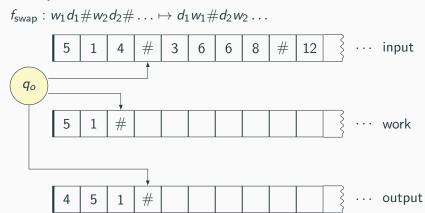


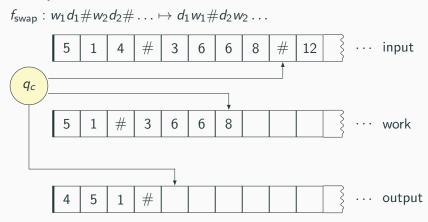


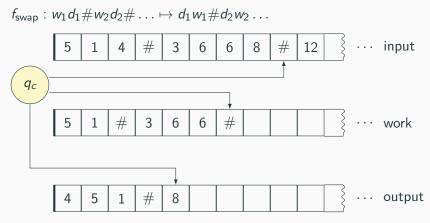


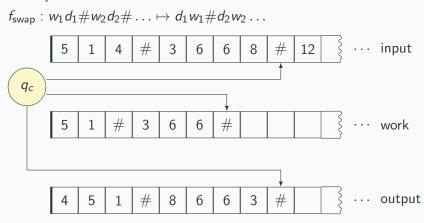


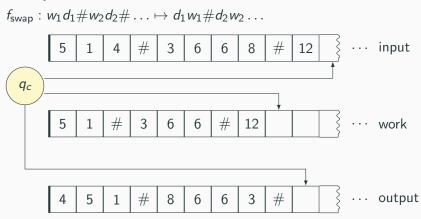












Three tape deterministic Turing machine

- Read-only one-way input tape
- Two-way working tape
- Write-only one-way output tape

M computes $f: \mathbb{D}^{\omega} \to \mathbb{D}^{\omega}$ if for all $x \in \text{dom}(f)$, M writes f(x) in the limit

Theorem (Filiot and Winter 2021)

The synthesis problem of *computable functions* from non-deterministic asynchronous transducers over a *finite alphabet* is undecidable.

Three tape deterministic Turing machine

- Read-only one-way input tape
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M computes $f: \mathbb{D}^{\omega} \to \mathbb{D}^{\omega}$ if for all $x \in \text{dom}(f)$, M writes f(x) in the limit

Theorem (Filiot and Winter 2021)

The synthesis problem of *computable functions* from non-deterministic asynchronous transducers over a *finite alphabet* is undecidable.

→ Restrict to functional specifications, i.e. specifications that define functions.

$$f_{swap}: w_1 d_1 \# w_2 d_2 \# \ldots \mapsto d_1 w_1 \# d_2 w_2 \ldots$$

$$f_{\text{swap}}: w_1 d_1 \# w_2 d_2 \# \ldots \mapsto d_1 w_1 \# d_2 w_2 \ldots$$

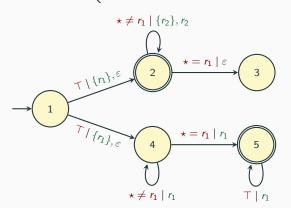
- → Definable by a non-deterministic register transducer (in the manuscript)
- → Computable, not by a sequential transducer

Example

$$f_{\text{swap}}: w_1 d_1 \# w_2 d_2 \# \ldots \mapsto d_1 w_1 \# d_2 w_2 \ldots$$

Co-example

$$f_{\mathsf{again}}: dw \mapsto \left\{ egin{array}{ll} w & \mathsf{if} \ d \notin w \\ d^\omega & \mathsf{otherwise} \end{array} \right.$$



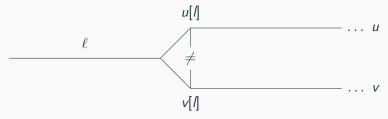
A register transducer defining $f_{\rm again}$

Continuity

Cantor distance

For
$$u, v \in \mathbb{D}^{\omega}$$
, $d(u, v) = \begin{cases} 0 \text{ if } u = v \\ 2^{-|u \wedge v|} \text{ otherwise} \end{cases}$

 $u \wedge v$: longest common prefix ℓ of u and v



Continuous function

 $f: \mathbb{D}^{\omega} \to \mathbb{D}^{\omega}$ is continuous if:

$$\lim_{n\infty} f(x_n) = f(\lim_{n\infty} (x_n))$$

Computability over finite alphabets

Theorem (Dave et al. 2019)

Let $f: \Sigma^{\omega} \to \Sigma^{\omega}$ be a function definable by a non-deterministic transducer over a *finite alphabet*. Then f is continuous iff it is computable.

Computability over finite alphabets

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Theorem (Dave et al. 2019)

Computability of functions defined by nondeterministic transducers is decidable in PTime .

Computability and Continuity

Computability

 $f: \mathbb{D}^{\omega} \to \mathbb{D}^{\omega}$ computable: deterministic Turing machine that outputs f(x) in the limit.

Continuity

$$\lim_{n\infty} f(x_n) = f(\lim_{n\infty} (x_n))$$

Computability ⇒ **Continuity**

Deterministic machine: when reading head is at position k, the output only depends on the k first letters.

Computability and Continuity

Computability

 $f: \mathbb{D}^{\omega} \to \mathbb{D}^{\omega}$ computable: deterministic Turing machine that outputs f(x) in the limit.

Continuity

$$\lim_{n\infty} f(x_n) = f(\lim_{n\infty} (x_n))$$

Computability ⇒ **Continuity**

Deterministic machine: when reading head is at position k, the output only depends on the k first letters.

• The other implication does not always hold.

Continuity and computability

Theorem

A function defined by a non-deterministic register transducer over oligomorphic domains or $(\mathbb{N},<)$ is computable iff it is continuous.

Computability \Rightarrow Continuity is proved as before.

Continuity \Rightarrow Computability: requires to determine the next letter.

Next-letter problem

Input: $u, v \in \mathbb{D}^*$

Output: $d \in \mathbb{D}$ s.t. $\forall y \in \mathbb{D}^{\omega}$ s.t. $u \cdot y \in \text{dom}(f)$,

 $v \cdot d \leq f(u \cdot y)$ if it exists

No otherwise

Continuity and computability

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A function defined by a non-deterministic register transducer over oligomorphic domains or $(\mathbb{N},<)$ is computable iff it is continuous.

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 $\label{eq:Continuity} \textbf{Continuity} \Rightarrow \textbf{Computability: requires to determine the next letter.}$

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No otherwise

Theorem

For functions defined by register transducers over oligomorphic domains or ($\mathbb{N},<$), deciding computability is PSPACE-complete.

Summary

- ightharpoonup Continuity \equiv computability for functions defined by non-deterministic register transducers, over a large class of domains
- → This is decidable.

Related publications

- E., Filiot and Reynier (FoSSaCS 2020). "On Computability of Data Word Functions Defined by Transducers"
- E., Filiot, Lhote and Reynier (submitted to LMCS). "Computability of Data-Word Transductions over Different Data Domains"

Perspectives

Reactive Synthesis

- Good-for-games register automata
- Register-bounded synthesis over $(\mathbb{N}, <, 0)$
- Synthesis from logical formalisms: $FO_2[<_p, \sim]$, $FO_2[<_p, <_d]$

Computability

- Generalise to other data domains and two-way models
- Lift the functionality requirement: automatic specifications

Going Further

- Explore other formalisms than register automata
- Minimisation and learning of non-deterministic transducers

Perspectives

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