# Automatic Synthesis of Systems with Data

Léo Exibard Monday, September 6<sup>th</sup>, 2021

## ? $\parallel$ Environment $\models$ Specification

→ Generate a system from a specification

Implementing a specification Inputs In

Outputs Out



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# Synthesis

#### Inputs In

- ${\mathcal S}$  class of specifications  ${\mathcal S}\subseteq {\mathsf{In}}\times{\mathsf{Out}}$
- $\mathcal I$  class of implementations  $M: \mathsf{In} \to \mathsf{Out}$

*M* fulfils *S*, written  $M \models S$ , if for all  $i \in In, (i, M(i)) \in S$ 

Synthesis Problem for  ${\mathcal S}$  and  ${\mathcal I}$ 

- Input:  $S \in S$
- **Output:**  $M \in \mathcal{I}$ 
  - s. t.  $M \models S$  if it exists
  - No otherwise

$$n = \Sigma^{\omega}$$
 Out =

## **Reactive systems**



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

Specification  $S \subseteq (\Sigma \cdot \Gamma)^{\omega}$  in a high-level formalism (MSO, LTL)

Implementation = finite-state machine = reactive system

 $\Gamma \omega$ 

# **Running Example**

- Server and clients
- Everytime a client makes a request, it must eventually be granted
  - →  $G(req \Rightarrow F(grt))$

#### $\omega$ -Automata



A Universal co-Büchi Automaton checking that every client is eventually satisfied.

# How to Solve Reactive Synthesis?

- → Convert the MSO specification to an  $\omega$ -automaton
- → Solve a game on this automaton
- $\omega$ -regular games



A parity game corresponding to  $G(req \Rightarrow F(grt))$ .

# **Models for Reactive Systems**

Winning strategies in parity games are positional

Synchronous Sequential Transducers



- Automata with outputs
- Deterministically outputs a letter on reading a letter
- All states are accepting

# **Reactive Synthesis**

## Theorem (Büchi and Landweber 1969)

The synthesis problem from MSO specifications to Sequential Transducers is non-elementary (but decidable).

## **Proof steps**

- → Convert the MSO formula to an  $\omega$ -automaton
- → Solve a game on this automaton

# Theorem [folklore]

The synthesis problem from Universal  $\omega$ -Automata to Synchronous Sequential Transducers is ExpTime-c.

# **Reactive Synthesis**

## Theorem (Büchi and Landweber 1969)

The synthesis problem from MSO specifications to Sequential Transducers is non-elementary (but decidable).

## **Proof steps**

- → Convert the MSO formula to an  $\omega$ -automaton
- → Solve a game on this automaton

# Theorem [folklore]

The synthesis problem from Universal  $\omega$ -Automata to Synchronous Sequential Transducers is ExpTime-c.

## Theorem (Pnueli and Rosner 1989)

The synthesis problem from LTL specifications to Sequential Transducers is 2-ExpTime-c.

## Limitations

## Observations

- → Input and output alphabets are assumed to be finite sets
- → Large alphabets require additional techniques

#### Back to our running example

- Set  $C = \{1, \ldots, n\}$  of users
- $\Sigma = {req_1, \dots, req_n, \neg req}$  and  $\Gamma = {grt_1, \dots, grt_n, \neg grt}$
- Now, each user has a specific request
- Every request of client *i* is eventually granted:

$$\bigwedge_{1 \leq i \leq n} G\left(\mathsf{req}_i \to F(\mathsf{grt}_i)\right)$$

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$$\bigwedge_{1 \leq i \leq n} G\left(\operatorname{req}_i \to F(\operatorname{grt}_i)\right)$$

 $\rightarrow$  We consider the case where C is *infinite* and has some *structure*. 8

#### 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 D = (D, R, C): infinite set of data with predicates and constants
  - → e.g. ( $\mathbb{N}$ ,=), ( $\mathbb{Q}$ ,<), ( $\mathbb{N}$ ,<,0)
- $\Sigma$  finite alphabet of *labels*
- Data words: sequences of pairs (a, d) ∈ Σ × 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 Transitions $q \xrightarrow{\sigma, \varphi, A} q'$ **R** of registers • $\sigma \in \Sigma$ : label

- Store data
- Test register content

- - $\varphi \in QF(R, \star)$ : test
  - $A \subseteq R$ : assignment



An URA checking that every request is eventually granted.

# Synchronous Sequential Register Transducers

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

- $\mathcal{S}$ : 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 ⊨ S if it exists
  - No otherwise

#### Theorem

The unbounded synthesis problem is undecidable for S given as a Universal Register Automaton with  $\geq$  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 ⊨ 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  $(\mathbb{Q}, <)$ .

## **Reduction to the Finite Alphabet Case**

## **Action Sequences**

- Input actions: tests  $oldsymbol{arphi} \in \mathrm{QF}(R_k,\star)$
- Output actions:  $(A, r) \in 2^{R_k} \times R_k$



• Action sequence  $\alpha = a_1 a_2 \dots$ 

 $\mathsf{Comp}(\alpha) = \{ w \in \mathbb{D}^{\omega} \mid \alpha \text{ can be performed on reading } w \}$ 

#### Example

Sequence  $\alpha \quad \star \neq r_1, r_2 \quad (\{r_1\}, r_1) \quad \star \neq r_1, r_2 \quad (\{r_2\}, r_1) \quad \star = r_1$ Word  $w \quad 1 \qquad 1 \qquad 2 \qquad 1 \qquad 1$ Registers (0,0) (1,0) (1,0) (1,2) (1,2)

→  $w = 11211 \in \text{Comp}(\alpha)$ 

## **Reduction to the Finite Alphabet Case**

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- Input actions: tests  $oldsymbol{arphi} \in \mathrm{QF}(R_k,\star)$
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$$R_k = \{r_1, \dots, r_k\}$$
$$p \xrightarrow{i, \varphi \mid A, o, r} q$$

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## Example

- Sequence  $\alpha \quad \star \neq r_1, r_2 \quad (\{r_1\}, r_1) \quad \star \neq r_1, r_2 \quad (\{r_2\}, r_1) \quad \star = r_1$ Word w' 1 1 1 1 1 1 Registers (0,0) (1,0) (1,0)
- $\rightarrow$  w = 11111 is not compatible with  $\alpha$

## **Action Sequences**

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- Output actions:  $(A, r) \in 2^{R_k} \times R_k$

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• Action sequence  $\alpha = a_1 a_2 \dots$ 

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#### Example

Sequence  $\alpha' \quad \star \neq r_1, r_2 \quad (\{r_1\}, r_1) \quad \star = r_1, r_2 \quad (\{r_2\}, r_1) \quad \star = r_1$ Word  $w \quad 1 \qquad 1 \qquad ?$ Registers (0,0) (1,0) (1,0)

→  $\alpha'$  is not feasible

#### **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  $\omega$ -regular for S URA

 $W_{S,k} = \left( \mathsf{lab}\left( L_{S^{c},k} \right) \right)^{c}$ 

where  $L_{S^c,k} = \{ w \otimes \alpha \mid w \in \mathsf{Comp}(\alpha) \cap S^c \}$ 

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where  $L_{S^c,k} = \{ w \otimes \alpha \mid w \in \text{Comp}(\alpha) \cap S^c \}$ 

→ Reduces to  $\omega$ -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

NRA — dual — URA C<sub>x</sub>  $\langle \varphi \rangle$ DRA

#### Theorem

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

 $\rightarrow$  Simulate counting using antagonism between the players

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Non-regular behaviours



→ The set of feasible action words is not regular

#### 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.

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

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

- Generalises to oligomorphic data domains
- Over (ℕ, <), only the unbounded synthesis for one-sided DRA is known to be decidable</li>

#### **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**

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

**Asynchronous Register Transducers** 

# Theorem (Carayol and Löding 2015)

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

→ Relax finite-memory requirement ~→ computable implementations.

#### Example



#### Example










































Three tape deterministic Turing machine

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

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

 $\rightarrow$  Restrict to functional specifications, i.e. specifications that define functions.

### Example

 $f_{\mathsf{swap}}: w_1 d_1 \# w_2 d_2 \# \cdots \mapsto d_1 w_1 \# d_2 w_2 \dots$ 

# Example

 $f_{\mathsf{swap}}: w_1 d_1 \# w_2 d_2 \# \cdots \mapsto d_1 w_1 \# d_2 w_2 \dots$ 

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



# Continuity

### **Cantor distance**



### **Continuous function**

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

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

# 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.

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Theorem (Dave et al. 2019)

Computability of functions defined by nondeterministic transducers is decidable in  $\mathrm{PTIME}.$ 

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

Continuity

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

### $\textbf{Computability} \Rightarrow \textbf{Continuity}$

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

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

Continuity

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

### $\textbf{Computability} \Rightarrow \textbf{Continuity}$

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.

### Theorem

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

 $\label{eq:computability} Computability \Rightarrow Continuity is proved as before.$ 

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

#### Next-letter problem

Input: $u, v \in \mathbb{D}^*$ Output: $d \in \mathbb{D}$  s.t.  $\forall y \in \mathbb{D}^{\omega}$  s.t.  $u \cdot y \in \text{dom}(f)$ , $v \cdot d \preceq f(u \cdot y)$  if it existsNo otherwise

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

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	$v \cdot d \preceq f(u \cdot y)$ if it exists
	No otherwise

#### Theorem

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

- → 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"

### **Reactive Synthesis**

- Good-for-games register automata
- Register-bounded synthesis over  $(\mathbb{N},<,0)$
- Synthesis from logical formalisms: *FO*<sub>2</sub>[<<sub>p</sub>,~], *FO*<sub>2</sub>[<<sub>p</sub>,<<sub>d</sub>]

# 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

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