

# Decision Problems for Additive Regular Functions

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What are we studying?

Regular functions

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Languages,  $\Sigma^* \rightarrow \text{bool}$

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String transductions,  $\Sigma^* \rightarrow \Gamma^*$

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Numerical functions,  $\Sigma^* \rightarrow \mathbb{Z}$

DFA

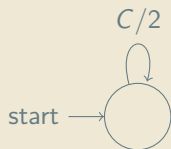
SST

?

# Regular Functions

Modelling a coffee shop: Attempt 1

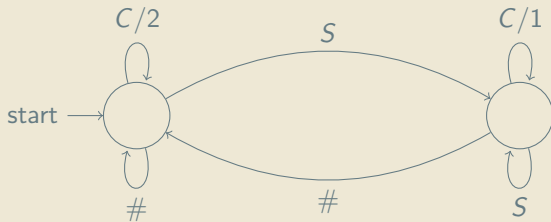
Finite automata with cost labels, a la Mealy machines



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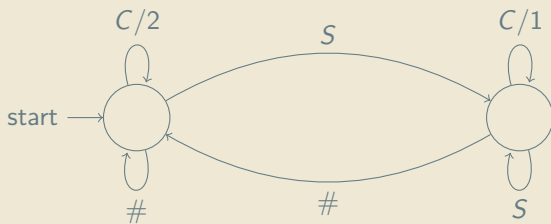




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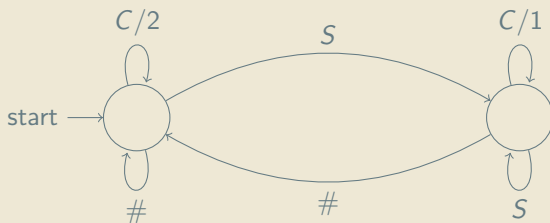


- Intuitive, analyzable

# Regular Functions

Modelling a coffee shop: Attempt 1

Finite automata with cost labels, a la Mealy machines



- ▶ Intuitive, analyzable
- ▶ But not very expressive. . .

# Regular Functions

Modelling a coffee shop: Attempt 1

What if the survey gives us a discount for coffee already purchased?

- ▶ Not possible if costs are paid up front
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Solution?

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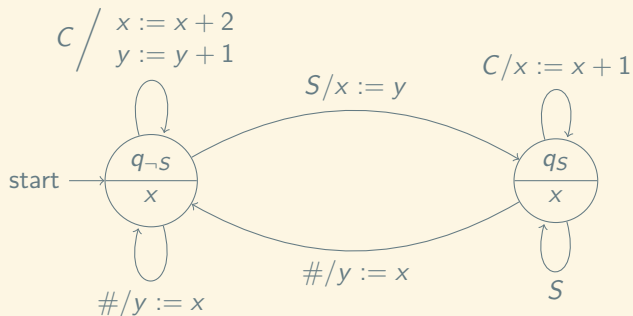
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Solution? Registers!

# Regular Functions / Cost Register Automata

Modelling a coffee shop: Attempt 2



# Regular Functions / Cost Register Automata

Properties, or why they're interesting

- ▶ Closure under linear combination, input reversal, etc.
- ▶ Fast equivalence procedure, decidable containment
- ▶ Equivalent to regular string-to-expression-tree transducers

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- ▶ Connections to weighted automata

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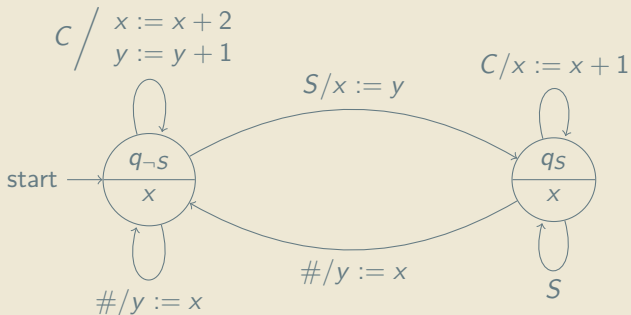
CRA

Motivating Question: How do we Compute the Register Complexity?

# Motivating Question

Register complexity

Does the coffee shop CRA really need 2 registers?



# Register Separation

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Confessions of a coffee addict

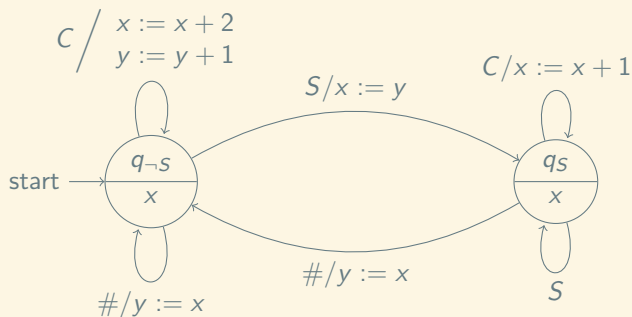
- ▶ Pick a large number, say  $c = 1,000,000$



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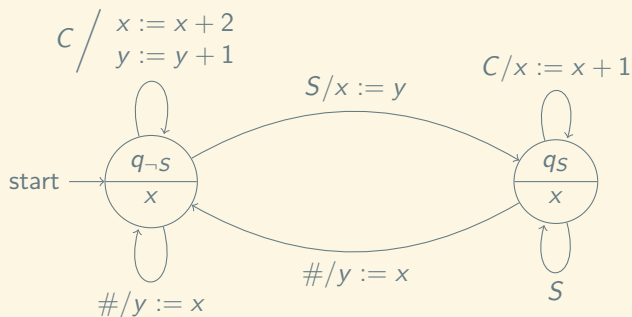
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- ▶ Observe what happens after processing  $C^c = CC \dots C$
- ▶  $|x - y| \geq c$



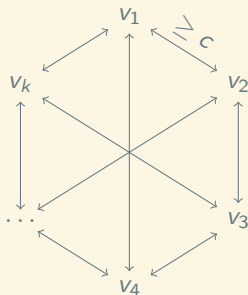
# Register Separation

- ▶ In general, for each  $c$ , there is a path to  $q_{-S}$  so  $|x - y| \geq c$
- ▶ No 1-register machine can make up these arbitrary differences in finite time

# Register Separation

Generalizing to  $k$  registers

- ▶ Pick a state  $q$ , and  $k$  registers
- ▶ Say, for each  $c$ , there is a string to  $q$  so every pair is at least  $c$  apart



- ▶ Then  $k$  registers are really necessary

# Register Separation

## Establishing the Converse

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Establishing the converse

## Claim

If the registers are not  $k$ -separable, then  $k - 1$  registers suffice

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Separation:  $\exists q, \forall c, \exists \sigma, \forall u, v, |u - v| \geq c$

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Establishing the converse

## Claim

If the registers are not  $k$ -separable, then  $k - 1$  registers suffice

**Non-Separation:**  $\forall q, \exists c, \forall \sigma, \exists u, v, |u - v| < c$



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- ▶ Says  $u - v = d_{uv}$ , where  $-c < d_{uv} < c$
- ▶ Wherever we see “ $v$ ”, replace with “ $u - d_{uv}$ ”

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$$\exists c, \forall \sigma, \bigwedge_q \bigvee_{u,v} |u - v| < c$$

$$(q, \langle u, v \rangle, d_{uv}) \xrightarrow{\begin{array}{l} u' := u'' + 2 \\ v' := v'' + 3 \end{array}} (q', \langle \_, \_ \rangle, \_)$$

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- ▶ Inductive backpropagation!
- ▶ Invariants maintained in DNF form

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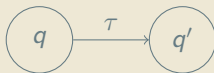
$$\left( q, \left\{ \begin{array}{l} \langle u, v \rangle, \quad d_{uv} \\ \langle u'', v'' \rangle, \quad d_{u''v''} \end{array} \right\} \right) \xrightarrow{\begin{array}{l} u' := u'' + 2 \\ v' := v'' + 3 \end{array}} \left( q', \langle u', v' \rangle, d_{u''v''} - 1 \right)$$

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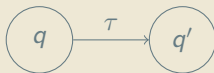
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# Register Separation

Establishing the converse

$$\text{INV}(q) := \text{INV}(q) \wedge \text{WP}(\text{INV}(q'), \tau)$$

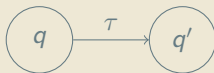


Repeat at each transition  $\tau$  until fixpoint

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## Claim

A fixpoint will eventually be reached

# Register Separation

Final result

## Theorem

*The register complexity is at least  $k$  iff the registers are  $k$ -separable*



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## Theorem

*Computing the register complexity is PSPACE-complete*

## Conclusion

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## What we talked about

- ▶ Described CRAs as a model for regular functions
- ▶ Introduced register separation in CRAs
- ▶ Outlined connection between separation and register complexity

# Conclusion

What we *didn't* talk about, i.e. what else is in the paper

- ▶ Machine-independent characterization of the register complexity
- ▶ Analysis of adversarial games over CRAs – optimal reachability  
Undecidable when domain is  $\mathbb{Z}$   
EXPTIME-complete when domain is  $\mathbb{N}$
- ▶ Proofs!

# Conclusion

## What's left to do

- ▶ Understanding register separation in models with binary addition, SSTs, etc.
- ▶ Optimal reachability in probabilistic variants
- ▶ Variants for  $\omega$ -strings / trees / ...

Thank you! Questions?

## Reserve Slides

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## Gotchas



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## Bounded registers

- ▶ Definition engineering; claims remain true in spirit
- ▶ Consider hypothetical “constant-0” register

# Gotchas

Domain of computation / Algebraic structure “+”

- ▶ Paper assumes  $\mathbb{Z}$ ; also holds for  $\mathbb{N}$
- ▶ Free algorithm for  $\mathbb{Q}$ : The rationals admit a notion of “GCD”

## Conjecture

- ▶ *Similar results hold for  $\mathbb{R}$  as well*
- ▶ *Can be easily generalized to any commutative group*

# Reserve Slides

## Weighted automata

# Regular Functions / Cost Register Automata

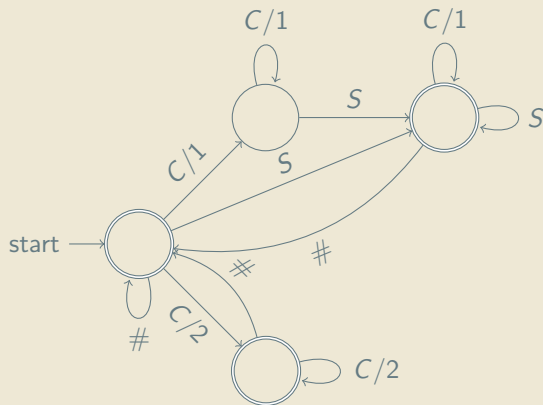
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Use non-determinism!

# Regular Functions / Cost Register Automata

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# Regular Functions / Cost Register Automata

## Connection to weighted automata

- ▶ CRAs are equivalent to unambiguous WA
- ▶ CRA (min, +c) equivalent to (full) WA  
 $x := \min(x, y), y := z + 3$
- ▶ Weighted automata are inherently non-deterministic

Fin!