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The Simplest Non-Regular Deterministic Context-Free Language

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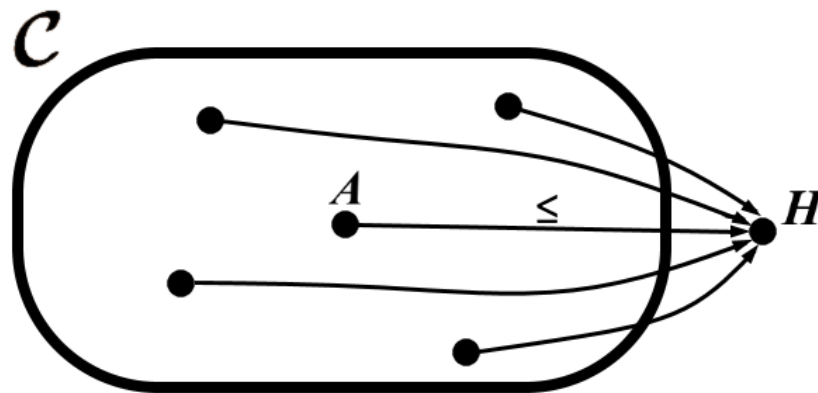
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\mathcal{C} -Hard Problems

\mathcal{C} is a complexity class of **decision problems** (i.e. formal languages)

$A \leq B$ is a **reduction** transforming a problem A to a problem B (a preorder), which is assumed not to have a higher computational complexity than \mathcal{C}

H is a **\mathcal{C} -hard problem** (under the reduction \leq) if for every $A \in \mathcal{C}$, $A \leq H$



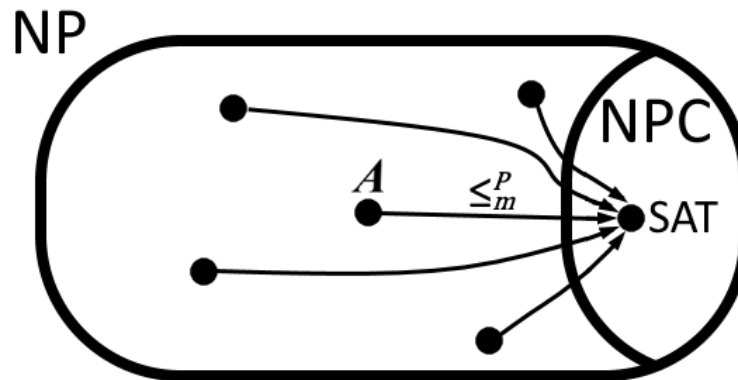
- If a \mathcal{C} -hard problem has a (computationally) “easy” solution, then each problem in \mathcal{C} has an “easy” solution (via the reduction).
- If a \mathcal{C} -hard problem H is in \mathcal{C} (a so-called **\mathcal{C} -complete problem**), then H belongs to the **hardest problems** in the class \mathcal{C} .

The Most Prominent Example: NP-Hard Problems

$\mathcal{C} = \text{NP}$ is the class of decision problems solvable in polynomial time by a nondeterministic Turing machine

$A \leq_m^P B$ is a **polynomial-time** many-one reduction (Karp reduction) from A to B

the satisfiability problem **SAT** is **NP-hard**: for every $A \in \text{NP}$, $A \leq_m^P \text{SAT}$

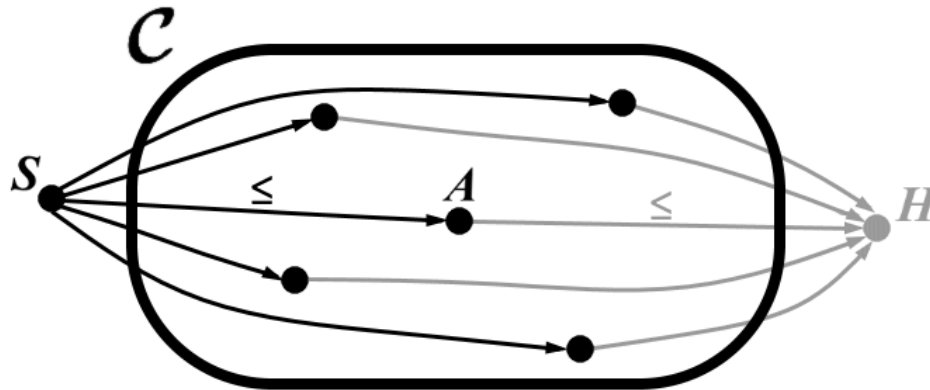


- If an NP-hard problem is polynomial-time solvable, then each NP problem would be solved in polynomial time.
- The NP-hard problem SAT is in NP (i.e. SAT is **NP-complete**), that is, SAT belongs to the **hardest problems** (NPC) in the class NP.

\mathcal{C} -Simple Problems

a conceptual counterpart to \mathcal{C} -hard problems:

S is a \mathcal{C} -simple problem (under the reduction \leq) if for every $A \in \mathcal{C}$, $S \leq A$



- If a \mathcal{C} -simple problem S proves to be not “easy”,
e.g. S is not solvable by a machine M (M can compute the reduction \leq),
then all problems in \mathcal{C} are not “easy”, i.e. \mathcal{C} cannot be solved by M .
→ **a new proof technique:** a lower bound known for one \mathcal{C} -simple problem S extends to the whole class of problems \mathcal{C}
- If a \mathcal{C} -simple problem S is in \mathcal{C} , then S is the **simplest problem** in the class \mathcal{C} .

A Trivial Example: SAT is simple for the class of NP-hard problems under \leq_m^P

A Nontrivial Example of a \mathcal{C} -Simple Problem

$$\mathcal{C} = \text{DCFL}' = \text{DCFL} \setminus \text{REG}$$

is the class of **non-regular deterministic context-free languages**

$L_1 \leq_{tt}^A L_2$ is a **truth-table reduction** (a stronger Turing reduction) from L_1 to L_2 implemented by a **Mealy machine with the oracle L_2**

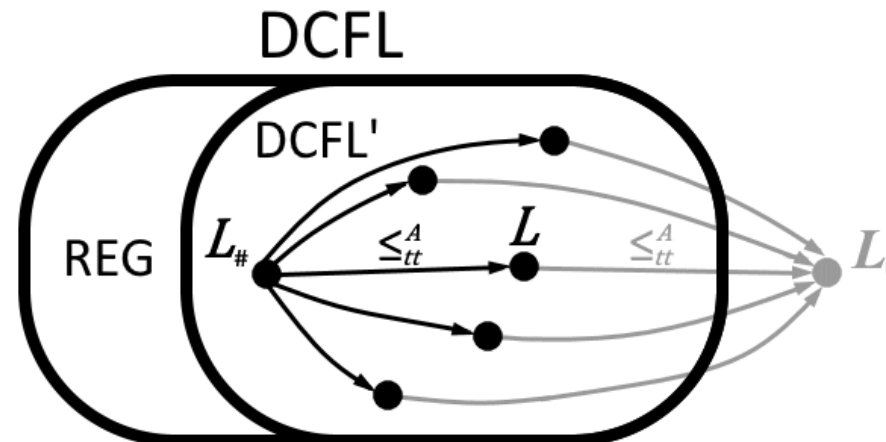
The Main Result:

the language $L_{\#} = \{0^n 1^n \mid n \geq 1\}$ over the binary alphabet $\{0, 1\}$ is

DCFL'-simple under the reduction \leq_{tt}^A : for every $L \in \text{DCFL}'$, $L_{\#} \leq_{tt}^A L$

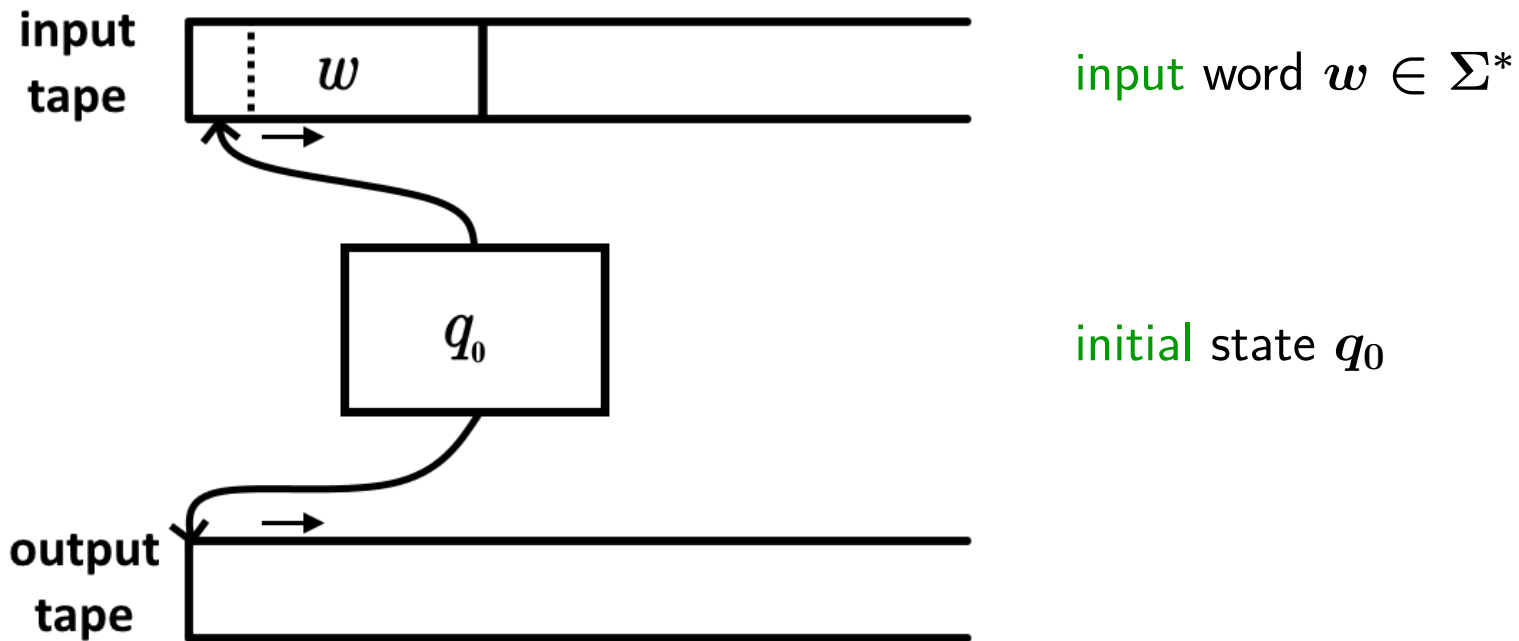
$\longrightarrow L_{\#} \in \text{DCFL}'$ is the **simplest** non-regular deterministic context-free languages

cf. the **hardest** context-free language L_0 due to S. Greibach (1973) is **CFL-hard**



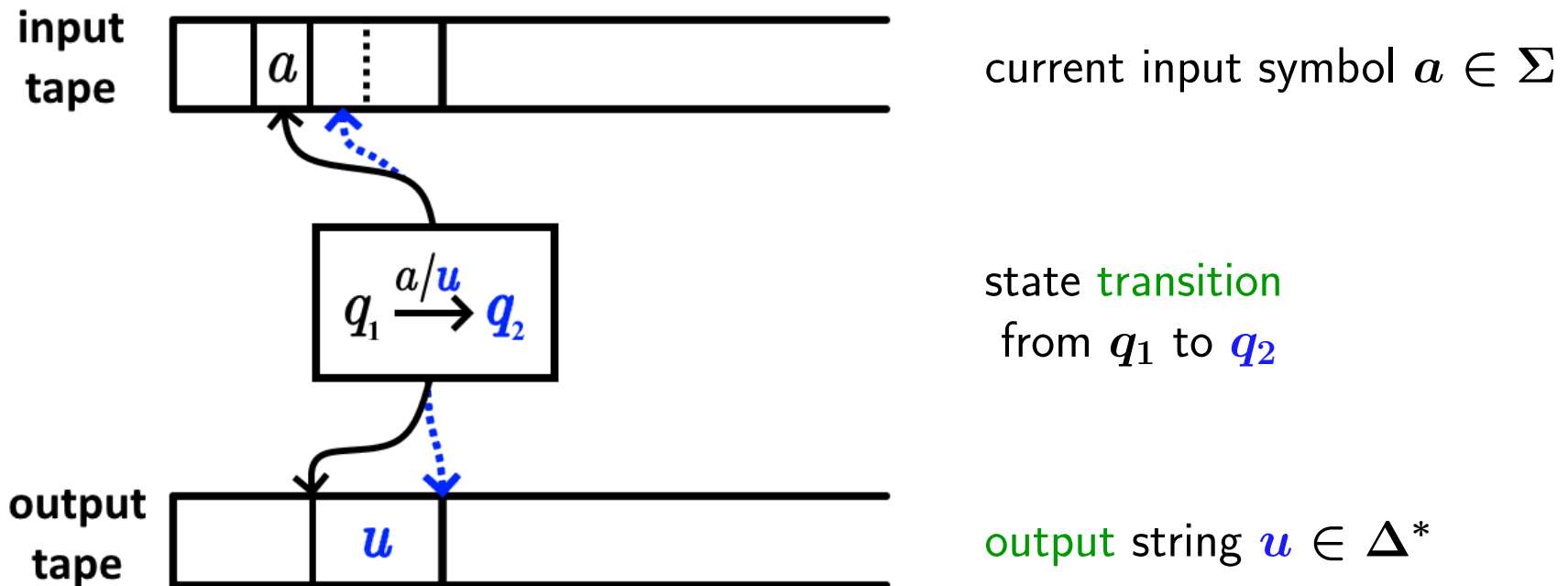
Mealy Machines

\mathcal{A} is a **Mealy Machine** with an input/output alphabet Σ/Δ
i.e. a deterministic finite automaton with an **output tape**:



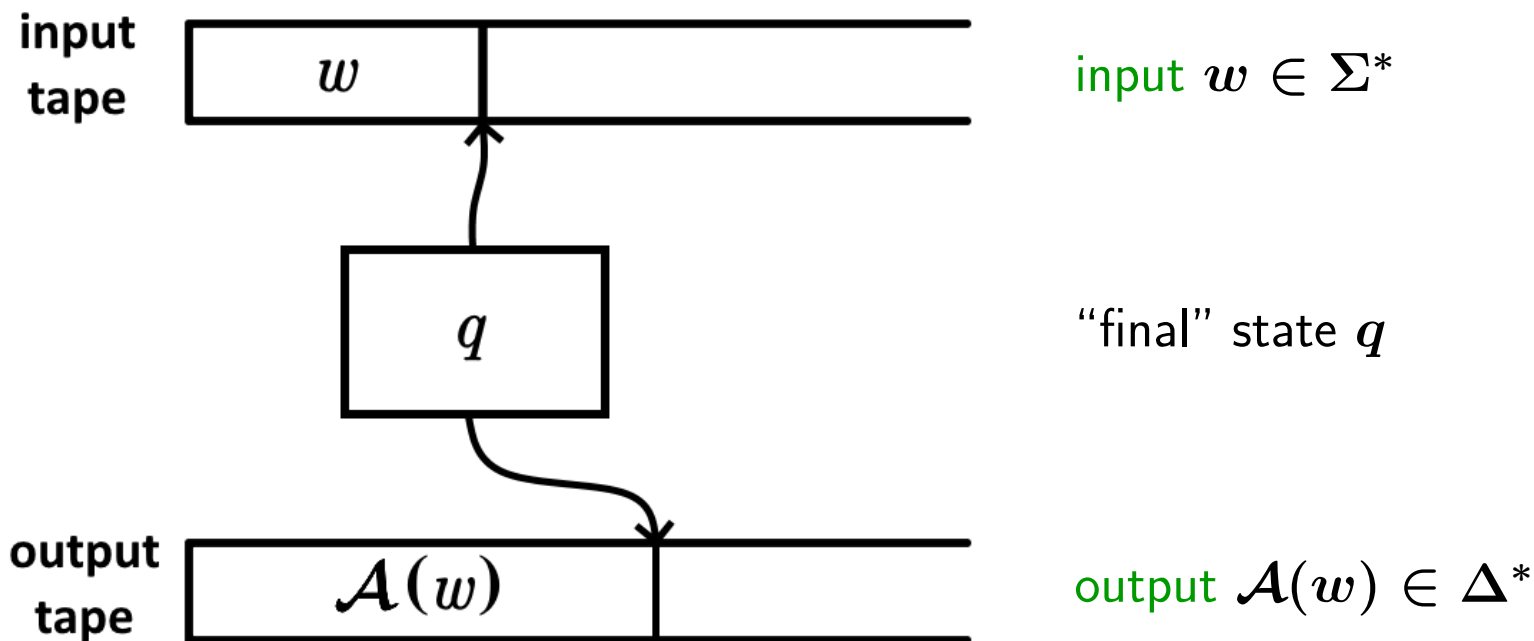
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Mealy Machines

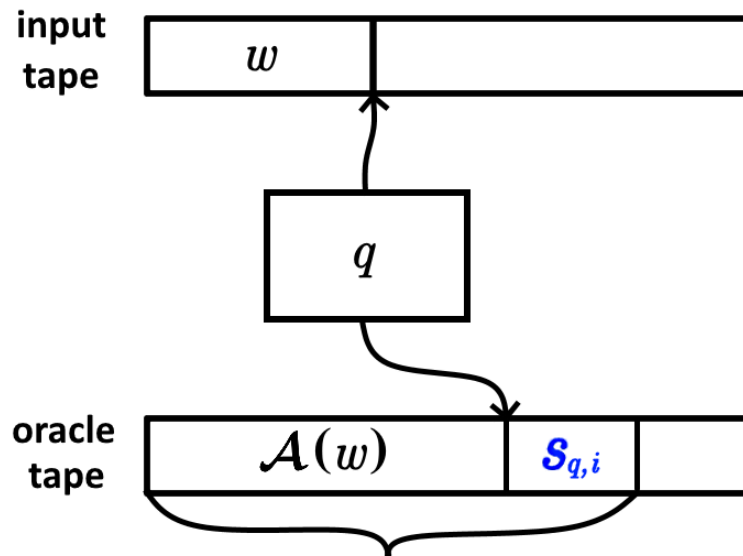
\mathcal{A} is a **Mealy Machine** with an input/output alphabet Σ/Δ
i.e. a deterministic finite automaton with an **output tape**:



→ a deterministic finite-state **transducer**: $w \in \Sigma^* \mapsto \mathcal{A}(w) \in \Delta^*$

The Truth-Table Reduction by Oracle Mealy Machines

\mathcal{A}^{L_2} is a Mealy Machine \mathcal{A} with an oracle $L_2 \subseteq \Delta^*$:



for each state q of \mathcal{A} :

- r_q suffixes $s_{q,1}, \dots, s_{q,r_q} \in \Delta^*$
- truth table $T_q : \{0, 1\}^{r_q} \rightarrow \{0, 1\}$ with r_q variables

r_q queries: $\overset{?}{\in} L_2$ for every $i = 1, \dots, r_q$

$w \in \Sigma^*$ is accepted by \mathcal{A}^{L_2} iff w brings \mathcal{A} to the state q such that

$$T_q \left(\mathcal{A}(w) \cdot s_{q,1} \overset{?}{\in} L_2, \mathcal{A}(w) \cdot s_{q,2} \overset{?}{\in} L_2, \dots, \mathcal{A}(w) \cdot s_{q,r_q} \overset{?}{\in} L_2 \right) = 1$$

$L_1 \leq_{tt}^A L_2$: $L_1 \subseteq \Sigma^*$ is truth-table reducible to $L_2 \subseteq \Delta^*$ iff

$L_1 = \mathcal{L}(\mathcal{A}^{L_2})$ is accepted by some Mealy machine \mathcal{A}^{L_2} with oracle L_2

Proposition: The relation \leq_{tt}^A is a preorder.

Why $L_{\#} = \{0^n 1^n \mid n \geq 1\}$ Is the Simplest DCFL' language?

any reduced context-free grammar G generating a non-regular language $L \subseteq \Delta^*$ is self-embedding: there is a self-embedding nonterminal A admitting the derivation

$A \Rightarrow^* xAy$ for some non-empty strings $x, y \in \Delta^+$ (Chomsky, 1959)

G is reduced $\longrightarrow S \Rightarrow^* vAz$ and $A \Rightarrow^* w$ for some $v, w, z \in \Delta^*$

$\longrightarrow S \Rightarrow^* vx^mwy^mz \in L$ for every $m \geq 0$ (1)

??? a conceivable (one-one) reduction from $L_{\#}$ to L : for every $m, n \geq 1$,

$$0^m 1^n \in \{0, 1\}^* \longmapsto vx^mwy^nz \in \Delta^*$$

(the inputs outside 0^+1^+ are mapped onto some fixed string outside L)

since $0^m 1^n \in L_{\#}$ **implies** $vx^mwy^nz \in L$ by (1)

!!! however, the opposite implication may not be true:

Why $L_{\#}$ Is the Simplest DCFL' language? (cont.)

!!! however, the **opposite implication** may not be true:

for the DCFL' language $L_1 = \{a^m b^n \mid 1 \leq m \leq n\}$ over $\Delta = \{a, b\}$

there are **no** words $v, x, w, y, z \in \Delta^*$ such that for every $m, n \geq 1$,

$$vx^m wy^n z \in L_1 \text{ would ensure } m = n$$

nevertheless, already **two** inputs $a^m b^{n-1} \stackrel{?}{\in} L_1$ and $a^m b^n \stackrel{?}{\in} L_1$ decides $m \stackrel{?}{=} n$

→ the **truth-table reduction** from $L_{\#}$ to L_1 with two queries to the oracle L_1 :

$$0^m 1^n \in \{0, 1\}^* \longmapsto vx^m wy^{n-1} z \in \Delta^*, \quad vx^m wy^n z \in \Delta^*$$

where $x = a$, $y = b$, $v = w = z = \varepsilon$ is the empty string

satisfying $0^m 1^n \in L_{\#}$ **iff** ($vx^m wy^{n-1} z \notin L_1$ **and** $vx^m wy^n z \in L_1$)

this can be **generalized** to any DCFL' language L :

The Main Technical Result

Theorem: Let $L \subseteq \Delta^*$ be a *non-regular deterministic context-free language* over an alphabet Δ . There exist non-empty words $v, x, w, y, z \in \Delta^+$ and a language $L' \in \{L, \bar{L}\}$ (where $\bar{L} = \Delta^* \setminus L$ is the complement of L) such that

1. **either** for all $m, n \geq 0$, $vx^mwy^nz \in L'$ **iff** $m = n$,
2. **or** for all $m, n \geq 0$, $vx^mwy^nz \in L'$ **iff** $m \leq n$.

		1.				
$m \backslash n$	n	0	1	2	3	...
0		$\in L'$	$\notin L'$	$\notin L'$	$\notin L'$	
1		$\notin L'$	$\in L'$	$\notin L'$	$\notin L'$	
2		$\notin L'$	$\notin L'$	$\in L'$	$\notin L'$	
3		$\notin L'$	$\notin L'$	$\notin L'$	$\in L'$	
\vdots						\dots

		2.				
$m \backslash n$	n	0	1	2	3	...
0		$\in L'$	$\in L'$	$\in L'$	$\in L'$	
1		$\notin L'$	$\in L'$	$\in L'$	$\in L'$	
2		$\notin L'$	$\notin L'$	$\in L'$	$\in L'$	
3		$\notin L'$	$\notin L'$	$\notin L'$	$\in L'$	
\vdots						\dots

In particular, for all $m \geq 0$ and $n > 0$,

$$(vx^mwy^{n-1}z \notin L' \text{ and } vx^mwy^nz \in L') \text{ iff } m = n.$$

The Truth-Table Reduction From $L_{\#}$ to Any DCFL' L

implemented by a **Mealy machine** \mathcal{A}^L with **two queries** to the oracle L :

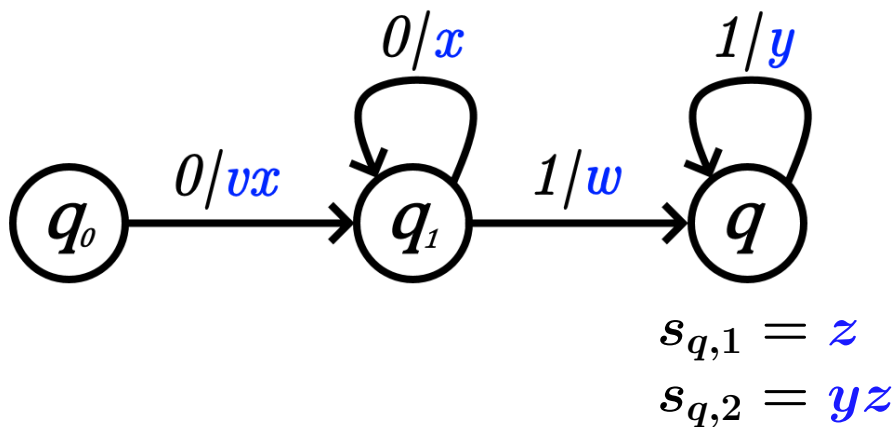
For any DCFL' language $L \subseteq \Delta^*$, **Theorem** provides $v, x, w, y, z \in \Delta^+$ and $L' \in \{L, \bar{L}\}$, say $L' = L$ (analogously for $L' = \bar{L}$), such that

$$(vx^mwy^{n-1}z \notin L \text{ and } vx^mwy^n z \in L) \text{ iff } m = n. \quad (2)$$

\mathcal{A}^L transforms the input $0^m 1^n$ to the output $\mathcal{A}(0^m 1^n) = vx^mwy^{n-1} \in \Delta^+$

(the inputs outside $0^+ 1^+$ are rejected), while moving to the state q

with $r_q = 2$ **suffixes** $s_{q,1}, s_{q,2}$ and the **truth table** $T_q : \{0, 1\}^2 \longrightarrow \{0, 1\}$



$\mathcal{A}(0^m 1^n) \cdot z = vx^mwy^{n-1}z \stackrel{?}{\in} L$	$\mathcal{A}(0^m 1^n) \cdot yz = vx^mwy^n z \stackrel{?}{\in} L$	T_q
0	1	1
0	0	0
1	1	0
1	0	0

It follows from (2) that $\mathcal{L}(\mathcal{A}^L) = L_{\#}$, i.e. $L_{\#} \leq_{tt}^A L$.

Ideas of the Proof of the Theorem

(inspired by some ideas on regularity of pushdown processes due to Jančar, 2020)

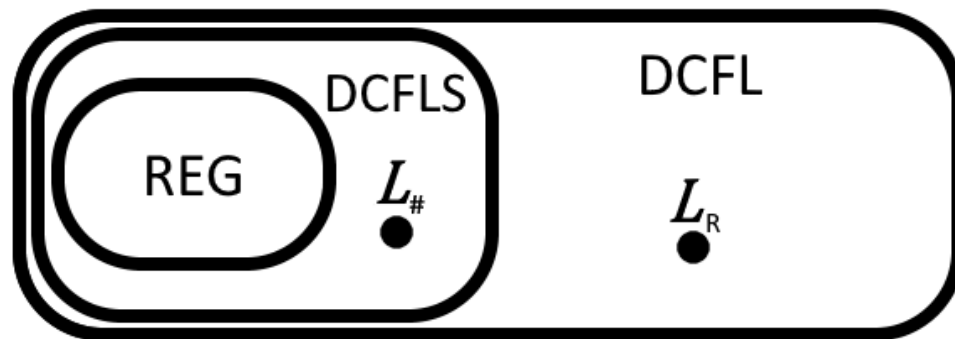
- any non-regular DCFL language $L \subseteq \Delta^*$ is accepted by a **deterministic pushdown automaton** \mathcal{M} by the empty stack
- since $L \notin \text{REG}$, there is a computation by \mathcal{M} , reaching configurations with an **arbitrary large stack** which is **being erased afterwards**, corresponding to $v, x, w, y, z \in \Delta^+$ such that $vx^mwy^mz \in L$ for all $m \geq 1$
- in addition, we aim to ensure that for all $m \geq 0$ and $n > 0$,
($vx^mwy^{n-1}z \notin L'$ **and** $vx^mwy^n z \in L'$) **iff** $m = n$
- we study the computation of \mathcal{M} on an infinite word that traverses **infinitely many pairwise non-equivalent configurations**
- we use a natural **congruence property** of language equivalence on the set of configurations (determinism of \mathcal{M} is essential)
- we apply **Ramsey's theorem** for extracting the required $v, x, w, y, z \in \Delta^+$ from the infinite computation

Basic Properties of DCFL'-Simple Problems

DCFLS is the class of DCFL'-simple problems

Proposition:

- $\text{REG} \subsetneq \text{DCFLS} \subsetneq \text{DCFL}$,
e.g. $L_{\#} \in \text{DCFLS}$, $L_R = \{wcw^R \mid w \in \{a,b\}^*\} \notin \text{DCFLS}$



- The class DCFLS is closed under complement and intersection with regular languages.
- The class DCFLS is not closed under concatenation, intersection, and union.

An Application of DCFL'-Simple $L_{\#}$ in Neural Networks

(this application has originally inspired the concept of a DCFL'-simple problem)

The Computational Power of Neural Networks (NNs)

(discrete-time recurrent NNs with the saturated-linear activation function)

depends on the information contents of weight parameters:

- **integer** weights: **finite automaton (FA)** (Minsky, 1967)
- **rational** weights: **Turing machine (TM)** (Siegelmann, Sontag, 1995)
polynomial time \equiv the complexity class P
- arbitrary **real** weights: **“super-Turing”** computation (Siegelmann, Sontag, 1994)
polynomial time \equiv the nonuniform complexity class P/poly
exponential time \equiv any I/O mapping
- increasing **Kolmogorov complexity** of real weights
polynomial time \equiv a proper **hierarchy** of nonuniform complexity classes
between P and P/poly (Balcázar, Gavaldà, Siegelmann, 1997)

??? the gap in the analysis between realistic **integer** and **rational** weights

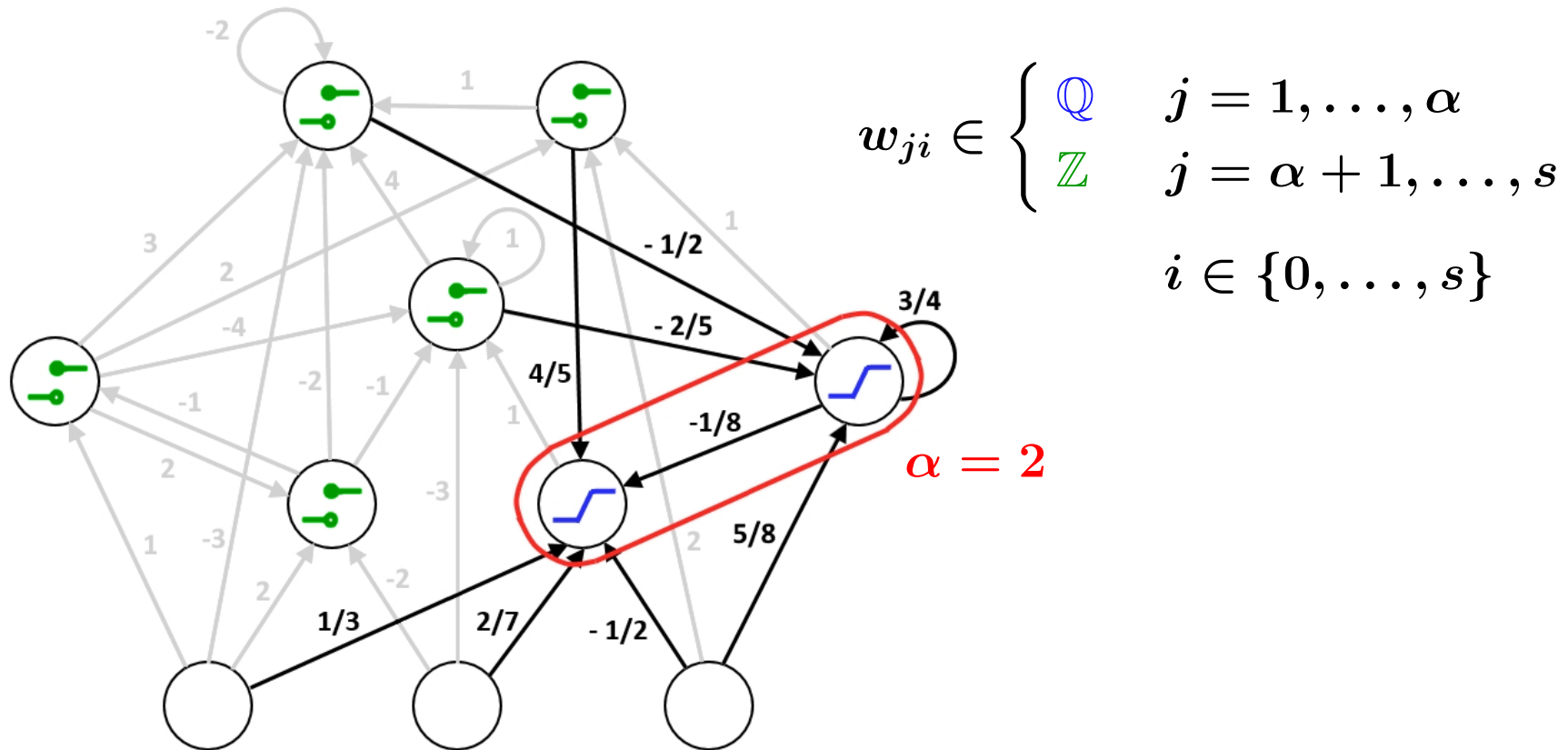
w.r.t. **Chomsky hierarchy**: **regular vs. recursively enumerable** languages

A Neural Network Model with Increasing Analogicity

from **integer** to **rational** weights

α ANN = a **binary-state** NN with **integer** weights

+ α **extra analog-state** neurons with **rational** weights



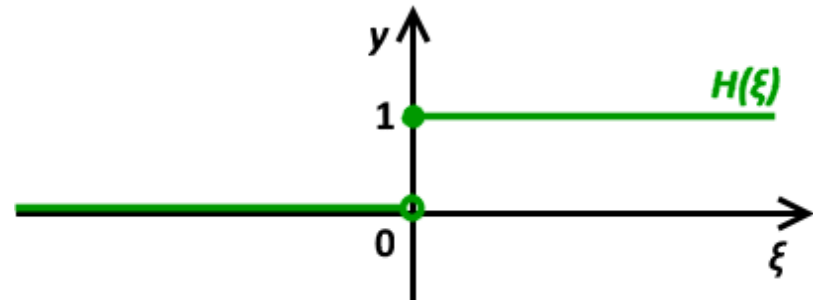
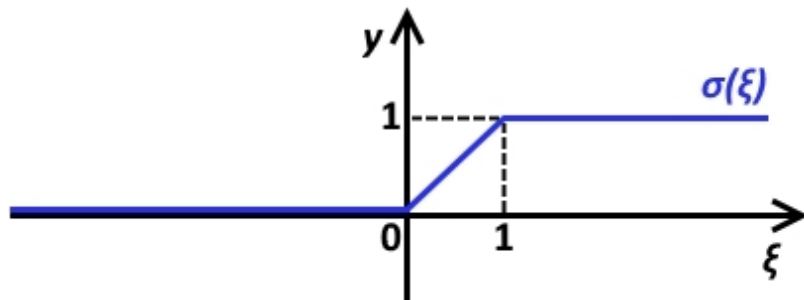
A Neural Network Model with Increasing Analogicity

from **binary** ($\{0, 1\}$) to **analog** ($[0, 1]$) states of neurons

α ANN = a **binary-state** NN with **integer** weights
 + **α extra analog-state** neurons with **rational** weights

$$y_j^{(t+1)} = \sigma_j \left(\sum_{i=0}^s w_{ji} y_i^{(t)} \right) \quad j = 1, \dots, s \quad \text{updating the states of neurons}$$

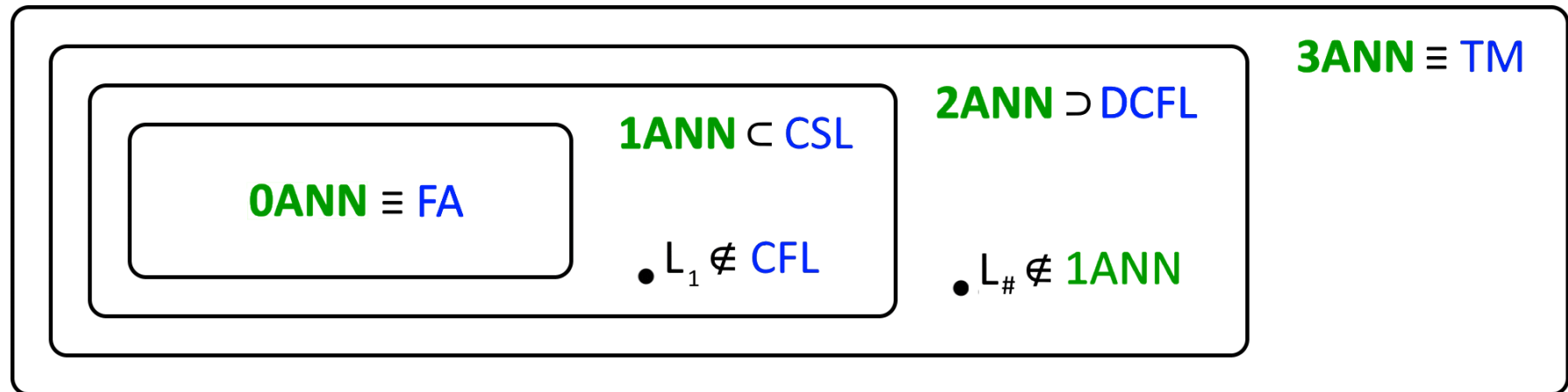
$$\sigma_j(\xi) = \begin{cases} \sigma(\xi) = \begin{cases} 1 & \text{for } \xi \geq 1 \\ \xi & \text{for } 0 < \xi < 1 \\ 0 & \text{for } \xi \leq 0 \end{cases} & j = 1, \dots, \alpha \quad \text{saturated-linear function} \\ H(\xi) = \begin{cases} 1 & \text{for } \xi \geq 0 \\ 0 & \text{for } \xi < 0 \end{cases} & j = \alpha + 1, \dots, s \quad \text{Heaviside function} \end{cases}$$



The Analog Neuron Hierarchy (Šíma, 2019, 2020)

the computational power of NNs increases with the number α of extra analog neurons:

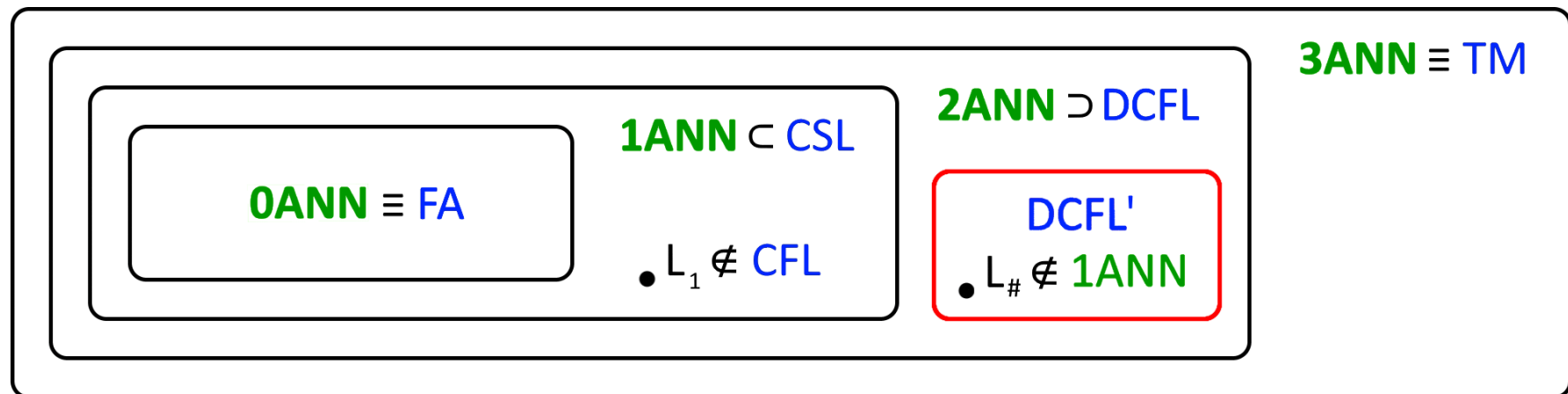
$$\begin{array}{ccccccc}
 \text{FA} & \equiv & 0\text{ANN} & \subseteq & 1\text{ANN} & \subseteq & 2\text{ANN} & \subseteq & 3\text{ANN} & \subseteq & \dots & \equiv & \text{TM} \\
 \uparrow & & & & & & \times & & & & & \uparrow & \\
 \text{integer weights} & & & & \text{Chomsky hierarchy} & & & & & & & \text{rational weights} &
 \end{array}$$



- $L_{\#} = \{0^n 1^n \mid n \geq 1\} \notin 1\text{ANN} \subset \text{CSL}$ (Context-Sensitive Languages)
- $L_1 = \left\{ x_1 \dots x_n \in \{0, 1\}^* \mid \sum_{k=1}^n x_{n-k+1} \left(\frac{3}{2}\right)^{-k} < 1 \right\} \in 1\text{ANN} \setminus \text{CFL}$
- $\text{DCFL} \subset 2\text{ANN}$
- $3\text{ANN} \equiv \text{TM}$

The Technique of Expanding a Lower Bound

- $L_{\#} \notin 1ANN$ with a **nontrivial** proof (based on the Bolzano–Weierstrass theorem) which can hardly be generalized to another DCFL' language
 - $L_{\#}$ is DCFL'-simple under \leq_{tt}^A
 - the reduction \leq_{tt}^A to any $L \in 1ANN$ can be implemented by 1ANN
- the known lower bound $L_{\#} \notin 1ANN$ for a single DCFL'-simple problem $L_{\#}$ is extended to the whole class $DCFL' \cap 1ANN = \emptyset$



Comments:

- If any DCFL' language proves to be CFL'-simple, then $CFL' \cap 1ANN = \emptyset$.
- $L_{\#}$ is **not CSL'-simple** since $L_{\#} \leq_{tt}^A L_1 \in 1ANN$ would imply $L_{\#} \in 1ANN$

A Summary

- We have introduced a **new notion of \mathcal{C} -simple problems** which is a conceptual counterpart to \mathcal{C} -hard problems.
- We have shown $L_{\#} = \{0^n 1^n \mid n \geq 1\}$ to be a **DCFL'-simple problem** under the truth-table reduction by oracle Mealy machines:

→ $L_{\#}$ is the **simplest DCFL' problem**

- We have proposed a **new proof technique** of expanding a lower bound known for a single \mathcal{C} -simple problem to the whole class of problems \mathcal{C} , which has been illustrated by a **nontrivial application** to the analysis of neural networks:

$$\text{DCFL'-simple } L_{\#} \notin 1\text{ANN} \quad \longrightarrow \quad \text{DCFL}' \cap 1\text{ANN} = \emptyset$$

Open Problems

- Is $L_{\#}$ **CFL'-simple** or **UCFL'-simple** (Unambiguous CFL') ?

$$(\longrightarrow \text{(U)CFL}' \cap 1\text{ANN} \stackrel{?}{=} \emptyset)$$

- Examples of nontrivial \mathcal{C} -simple problems for other complexity classes \mathcal{C} under suitable reductions ?