## The Tractability Frontier for NFA Minimization

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## Notation

- NFA: (Non-Deterministic) Finite State Automata
- DFA: Deterministic Finite State Automata
- UFA: Unambiguous Finite State Automata

Unambiguous $=$ at most one accepting run per string

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## Definition $(X \rightarrow Y$ Minimization standard version)

- Input: Automaton $A$ from class $X$
- Output: Automaton $B$ in class $Y$ such that
- $A$ and $B$ are equivalent
- $B$ is minimal in class $Y$


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## Example

- DFA $\rightarrow$ DFA $\approx$ classical DFA minimization problem
- DFA $\rightarrow$ NFA $\approx$ given a DFA, compute minimal NFA


## Notation

In this paper we'll use the decision version of state minimization

Definition $(X \rightarrow Y$ Minimization decision version)

- Input: Automaton $A$ from class $X$, integer $n$ in binary
- Output: Does there exist an automaton $B$ in class $Y$ such that
- $A$ and $B$ are equivalent and
- $B$ has at most $n$ states?


## Observation

Lower bounds for decision version imply lower bounds for standard version

## DFA Minimization

- An old-school problem
- Algorithms for minimizing DFAs are in every undergraduate CS curriculum
- If not, they should be
[Huffmann 1954, Moore 1956, Hopcroft 1971]
DFA $\rightarrow$ DFA Minimization is in $\mathscr{O}(n \log n)$


## But What About NFAs?

In practice: Bisimulation Minimization [Paige, Tarjan 1987]

- efficient
- usually makes the input automaton smaller

In general, NFA $\rightarrow$ NFA Minimization is PSPACE-complete

## But What About NFAs?

## Further Results

[Jiang, Ravikumar 1993]:

- UFA $\rightarrow$ UFA Minimization is NP-complete
- DFA $\rightarrow$ UFA Minimization is NP-complete
- DFA $\rightarrow$ NFA Minimization is PSPACE-complete


## But What About NFAs?

## Further Results

[Malcher 2003]: Minimization is NP-complete for

- DFA $\rightarrow k$-MDFA for all $k \geq 2$
- DFA $\rightarrow$ NFA(branching $k$ ) for all $k \geq 3$
k-MDFA: Possibly ambiguous automata with $k$ initial states, but otherwise a deterministic transition function

NFA(branching k): NFAs with $k$ possible computations per string

Several (technical) different techniques are used for lower bounds

## But What About NFAs?

## Question [Malcher 2003]

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The short answer
[Here]: No

## But What About NFAs?

## Question [Malcher 2003]

Are there any classes of non-DFAs with efficient minimization?

The long answer
[Here]: OK, yes. But we don't think they'll be very useful

## So What's the Result?

## Definition ( $\delta$ NFA)

The class of NFAs that

- have at most one pair $(q, a)$ such that $q \xrightarrow{a} q_{1}$ and $q \xrightarrow{a} q_{2}$
- have one start state
- are unambiguous
- do not loop


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## Theorem

For every class $\mathscr{N}$ of $N F A$ such that $\delta N F A \subseteq \mathscr{N}$ :

$$
\text { DFA } \rightarrow \mathscr{N} \text { Minimization is NP-hard }
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One NP lower bound proof that unifies and strengthens all previous cases

## Outline

(1) Some Technical Details

## A Proof Revisited (Jiang, Ravikumar 1993)

Definition (Vertex Cover)
$G=(V, E)$ graph
$V^{\prime} \subseteq V$ Vertex Cover of $G \Leftrightarrow \forall\left(v_{1}, v_{2}\right) \in E,\left\{v_{1}, v_{2}\right\} \cap V^{\prime} \neq \emptyset$

## Definition (Set Basis)

$\mathscr{B}, \mathscr{C}$ finite collections of finite sets
$\mathscr{B}$ Set Basis of $\mathscr{C} \Leftrightarrow \forall C \in \mathscr{C} \exists B_{C} \subseteq \mathscr{B}: \bigcup_{B \in B_{C}} B=C$

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Definition (Separable Normal Set Basis)
$\mathscr{B}, \mathscr{C}$ finite collections of finite sets
$\mathscr{B}$ Separable Normal Set Basis of $\mathscr{C} \Leftrightarrow \forall C \in \mathscr{C} \exists B_{C} \subseteq \mathscr{B}$ :

- $\biguplus B=C$ $B \in B_{C}$
- the sets in $B_{C}$ are disjoint
- $B_{C}$ contains at most two sets


## A Proof Revisited (Jiang, Ravikumar 1993)

## Decision Problems

- Vertex Cover:

Given $G=(V, E)$ and integer $k$, does there exist a Vertex Cover with at most $k$ nodes?

- Separable Normal Set Basis:

Given collection $\mathscr{C}$ and integer $s$, does there exist a Separable Normal Set Basis $\mathscr{B}$ with at most $s$ sets?

## A Proof Revisited (Jiang, Ravikumar 1993)

## Lemma

(Separable) Normal Set Basis is NP-complete

## Proof Idea

Reduction from Vertex Cover
Translate each edge ( $v_{i}, v_{j}$ ) in graph $G$ into the collection


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Translate each edge $\left(v_{i}, v_{j}\right)$ in graph $G$ into the collection


This collection has $|V|+5|E|$ sets

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## Proof Idea

Translate each edge $\left(v_{i}, v_{j}\right)$ in graph $G$ into the collection


This collection has $|V|+5|E|$ sets
$G$ has a Vertex Cover of size $k \Leftrightarrow$ this collection has a (Sep.) Normal Set Basis with $|V|+4|E|+k$ sets

## Strengthening the Jiang-Ravikumar Result

Lemma (Set Basis $=$ Sep.Norm.Set Basis on some NP-complete instances) For the above reduction from Vertex Cover to Sep. NSB we also have that
$G$ has a Vertex Cover of size $k$
$\Leftrightarrow$ the collection has a Separable NSB with $|V|+4|E|+k$ sets $\Leftrightarrow$ the collection has a Set Basis with $|V|+4|E|+k$ sets

## Proof.

If there is a Set Basis, show with a case study that there is also a Separable NSB

## From Sep. Normal Set Basis to Automata Minimization

Let $\mathscr{C}=\left\{C_{1}, \ldots, C_{n}\right\}$ be a collection of $n$ sets, $C_{i}=\left\{b_{i, 1}, \ldots, b_{i, m_{i}}\right\}$
$A$ is the DFA for $\{a C b \mid C \in \mathscr{C}$ and $b \in C\}$


## From Sep. Normal Set Basis to Automata Minimization

If there is a Separable NSB $\mathscr{B}=\left\{B_{1}, \ldots, B_{\ell}\right\}$ for $\mathscr{C}$, then
fix, for every $C_{x} \in \mathscr{C}$,

$$
B_{x}^{1} \text { and } B_{x}^{2} \in \mathscr{B} \text { s.t. } C_{x}=B_{x}^{1} \uplus B_{x}^{2}
$$

## From Sep. Normal Set Basis to Automata Minimization

If there is a Separable NSB $\mathscr{B}=\left\{B_{1}, \ldots, B_{\ell}\right\}$ for $\mathscr{C}$, then

is a $\delta$ NFA for $\{a C b \mid C \in \mathscr{C}$ and $b \in C\}$ of size $\ell+4$

## From Sep. Normal Set Basis to Automata Minimization

There is a Separable NSB $\mathscr{B}=\left\{B_{1}, \ldots, B_{\ell}\right\}$ for $\mathscr{C}$ if and only if

is a $\delta$ NFA for $\{a C b \mid C \in \mathscr{C}$ and $b \in C\}$ of size $\ell+4$

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is an NFA for $\{a C b \mid C \in \mathscr{C}$ and $b \in C\}$ of size $\ell+3$

## So we just proved ...

## Lemma

The following are equivalent:

- $\mathscr{C}$ has a Sep. NSB of at most $\ell$ sets
- there is a $\delta N F A$ for $L(A)$ of size at most $\ell+4$
- there is an NFA for $L(A)$ of size at most $\ell+3$


## Corollary

There exists a set of regular languages $\mathscr{L}$ such that

- DFA $\rightarrow \delta$ NFA Minimization is NP-complete
for DFAs accepting $\mathscr{L}$
- for each $L \in \mathscr{L}$, the minimal NFA for $L$ has one state less than the minimal $\delta N F A$ for $L$


## Putting Things Together

```
Theorem
Let \mathscr{N}\mathrm{ be a class of NFAs.}
If }\deltaNFA\subseteq\mathscr{N}\mathrm{ then DFA }->\mathscr{N}\mathrm{ Minimization is NP-hard.
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## Proof.

We gave a reduction from Vertex Cover to DFA $\rightarrow \delta$ NFA Minimization

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A decision algorithm for DFA $\rightarrow \mathscr{N}$ Minimization can approximate DFA $\rightarrow \delta$ NFA Minimization within a term 1

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The approximation for DFA $\rightarrow \mathscr{N}$ Minimization can be adapted to an approximation of Vertex Cover within a term 1

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The approximation for DFA $\rightarrow \mathscr{N}$ Minimization can be adapted to an approximation of Vertex Cover within a term 1

Approximating Vertex Cover within a constant term is NP-complete $\Rightarrow$ DFA $\rightarrow \mathscr{N}$ Minimization is NP-hard

## Outline

## (1) Some Technical Details

## (2) Closer to Determinism?

## (3) Concluding Remarks

## Are All Classes of non-DFAs hard to Minimize?

(non-DFAs: Classes $\mathscr{N}$ such that DFA $\subseteq \mathscr{N}$ but not $\mathscr{N} \subseteq$ DFA)

## Are All Classes of non-DFAs hard to Minimize?

Answer
Of course not!

Example (Infinitely many classes between DFA and $\delta$ NFA)
Take the class of DFAs, and add a single $\delta$ NFA
$\Rightarrow$ Minimization in $\mathbf{P}$ !

## Are All Classes of non-DFAs hard to Minimize?

Let's look at a more interesting example
Definition ( $\delta^{\prime}$ NFA)
The class of NFAs that

- have at most one pair $(q, a)$ such that $q \xrightarrow{a} q_{1}$ and $q \xrightarrow{a} q_{2}$
- have one start state
- are unambiguous
- for each input $w$, have at most one rejecting run
(For each input $w$ there are at most 2 runs: 1 accepting and 1 rejecting)


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## Observation

- $\delta^{\prime}$ NFAs can be minimized in $\mathbf{P}$
- but the minimal $\delta^{\prime}$ NFAs are the DFAs!


## $\delta^{\prime}$ NFA can be minimized in PTIME

Take $\delta^{\prime}$ NFA $A$ that's not a DFA, let $(q, a)$ be the unique state,label with

$$
q \xrightarrow{a} q_{1} \quad q \xrightarrow{a} q_{2}
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Let $w$ be a string that leads $A$ to $q$

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As $A$ is a $\delta^{\prime}$ NFA, it must accept all waw ${ }^{\prime}$
(otherwise there are two rejecting runs)

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(otherwise there are two rejecting runs)
So $A$ can be made smaller by merging $q_{1}$ and $q_{2}$ into new state $q_{3}$ from which $A$ accepts everything
$A$ becomes deterministic this way
So, determinization followed by standard minimization is a $\mathbf{P}$ algorithm

## Outline

## (1) Some Technical Details

2 Closer to Determinism?
(3) Concluding Remarks

## Concluding Remarks

## What did we do?

- State minimization is hard for all finite automata classes that include $\delta$ NFAs
- One proof unifying and strengthening previous approaches
- The minimization tractability frontier is between $\delta$ NFA and $\delta^{\prime}$ NFA


## Concluding Remarks

Is everything solved yet?

- What we didn't consider yet: fixed alphabet size
- What about approximations?


## Thank you for listening

