

# Improved Algorithms for the Automata-based Approach to Model-Checking

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# Automata-based approach to model-checking

- Programs **and** properties are formalized as **regular languages of infinite words** ;
- Any **regular** language of infinite words is accepted by a **nondeterministic Büchi** automaton (NBW) ;
- **The verification problem**: given a NBW A (that formalizes Prg) and a NBW B (that formalizes Prop), check if  **$L(A) \subseteq L(B)$** .

# Automata-based approach to model-checking

- The **language inclusion problem** for NBW is **PSpace-Complete** ;
- So, the complexity is rather high but **similar** (or easier than) to the complexity of many other verification problems ;
- Nevertheless, currently there is **no practical** algorithms to solve this language inclusion problem. The usual approach through **explicit complementation** is difficult.

# Plan of the talk

- Complementation of NBW
- Simulation pre-orders and fixed points
- An improved algorithm for emptiness of ABW
- The universality and language inclusion problems

# Complementation of NBW

## A forty year Saga (M.Vardi)

- 1961, Büchi: doubly exponential construction
- 1986, Sistla Vardi Wolper : simply exponential construction  $2^{O(n^2)}$
- 1988, Michel: lower bound  $2^{O(n \log n)}$
- 1989, Safra: (nearly) optimal solution  $2^{O(n \log n)}$  construction using determinization
- 1991, Klarlund:  $2^{O(n \log n)}$  construction without determinization
- 1997, Kupferman Vardi :  $2^{O(n \log n)}$  similar to Klarlund but more modular
- 2004, Yan: slightly better lower bound  $(0.76n)^n$
- 2004, Friedgut Kupferman Vardi: slightly better upper bound  $(0.97n)^n$

# Complementation of NBW

- **Few** attempts to implement the successive procedures:
  - Safra procedure have been implemented by Tasiran et al. (1995) and Thomas et al.(2005): need of **intricate data structures** and **very low scalability** (6 states);
  - KV procedure implemented by Gurumurthy et al. (2003): use **several optimisations** (based on simulation equivalences) but **very low scalability** (6 states);
  - Recently, Tabakov (2006) implemented KV with **BDDs** for checking universality but **very low scalability** (8 states).

# KV construction

## ABW and AcoBW

- The KV construction uses **alternating** Büchi word (ABW) and alternating coBüchi word (AcoBW) automata
- Alternating automata are **generalizations** of nondeterministic Büchi automata
- Let  $A=(Q,q_0,\Sigma,\delta,\alpha)$ 
  - in **nondeterministic** automata:  
 $\delta(q,\sigma) = \{q_1, q_2, \dots, q_n\}$
  - in **alternating** automata:  
 $\delta(q,\sigma) = \{\{q_1, q_2, \dots, q_n\}, \{r_1, r_2, \dots, r_m\}, \dots\}$

# KV construction

## ABW and AcoBW

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- Let  $A=(Q,q_0,\Sigma,\delta,\alpha)$ 
  - in **nondeterministic** automata:  
 $\delta(q,\sigma)=\{q_1,q_2,\dots,q_n\}$       equivalent to  $\{\{q_1\},\{q_2\},\dots,\{q_n\}\}$
  - in **alternating** automata:  
 $\delta(q,\sigma)=\{\{q_1,q_2,\dots,q_n\},\{r_1,r_2,\dots,r_m\},\dots\}$



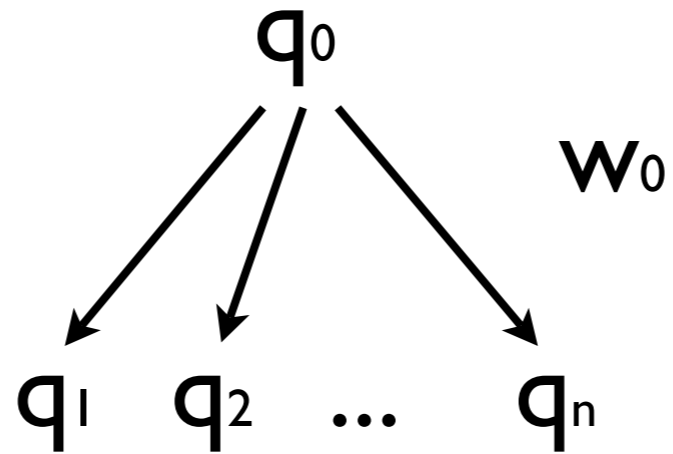
**Run** of an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$   
on a word  $w=w_0w_1\dots w_n\dots$

$q_0$   
↓

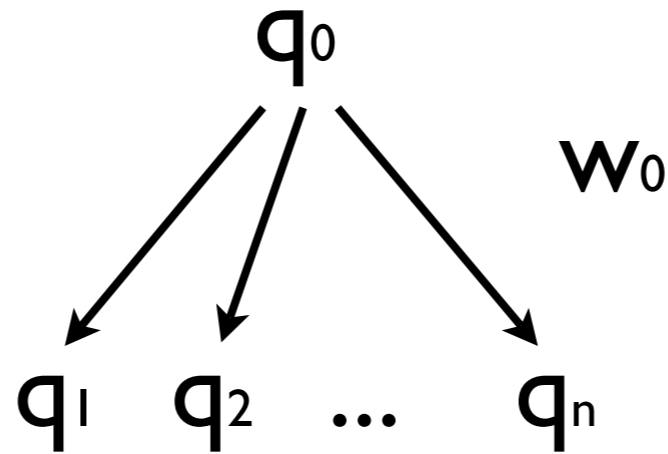
$w_0$

**Choose**  $\{q_1, q_2, \dots, q_n\} \in \delta(q_0, w_0)$

**Run** of an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$   
on a word  $w=w_0w_1\dots w_n\dots$

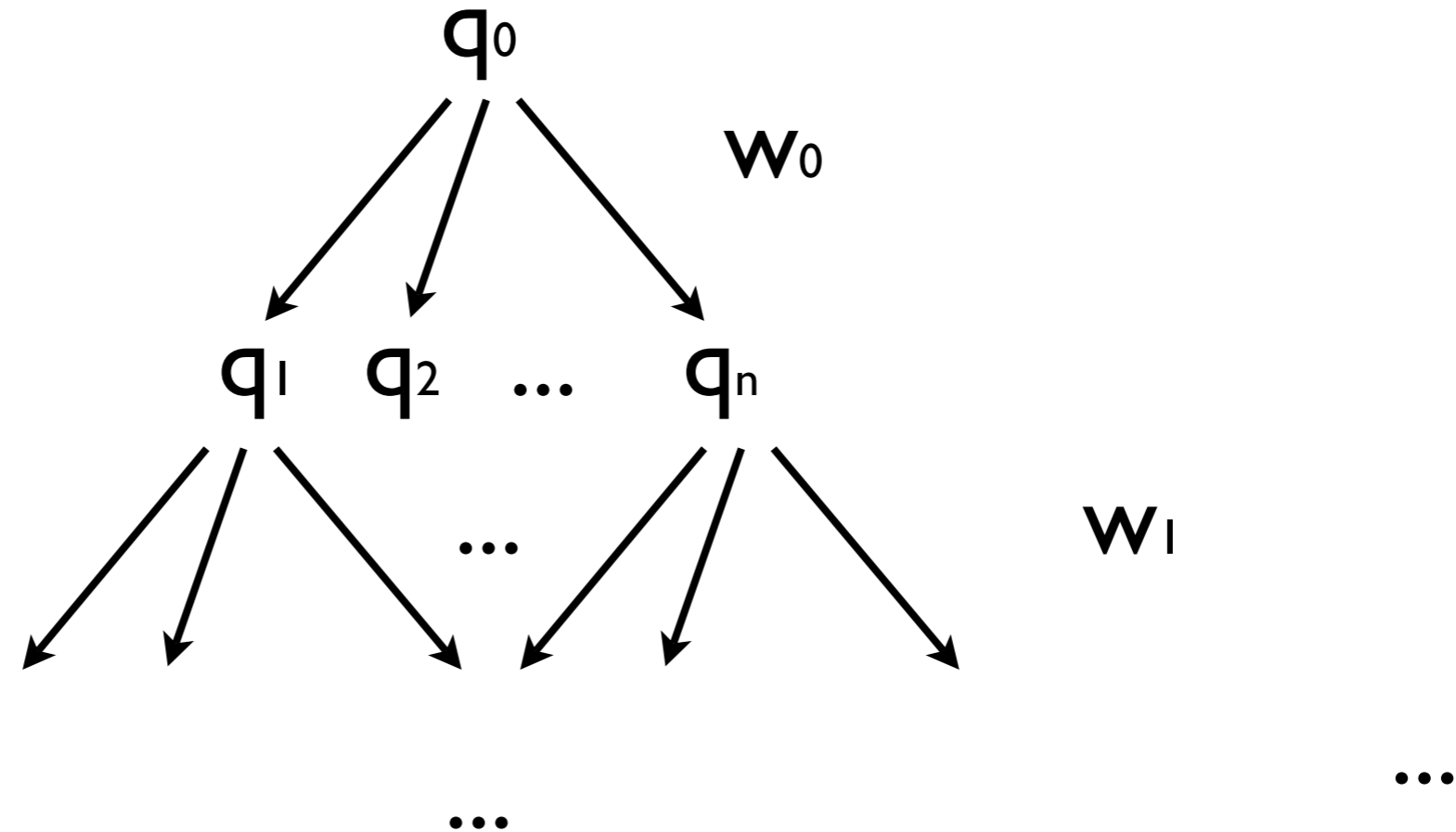


**Run** of an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$   
on a word  $w=w_0w_1\dots w_n\dots$



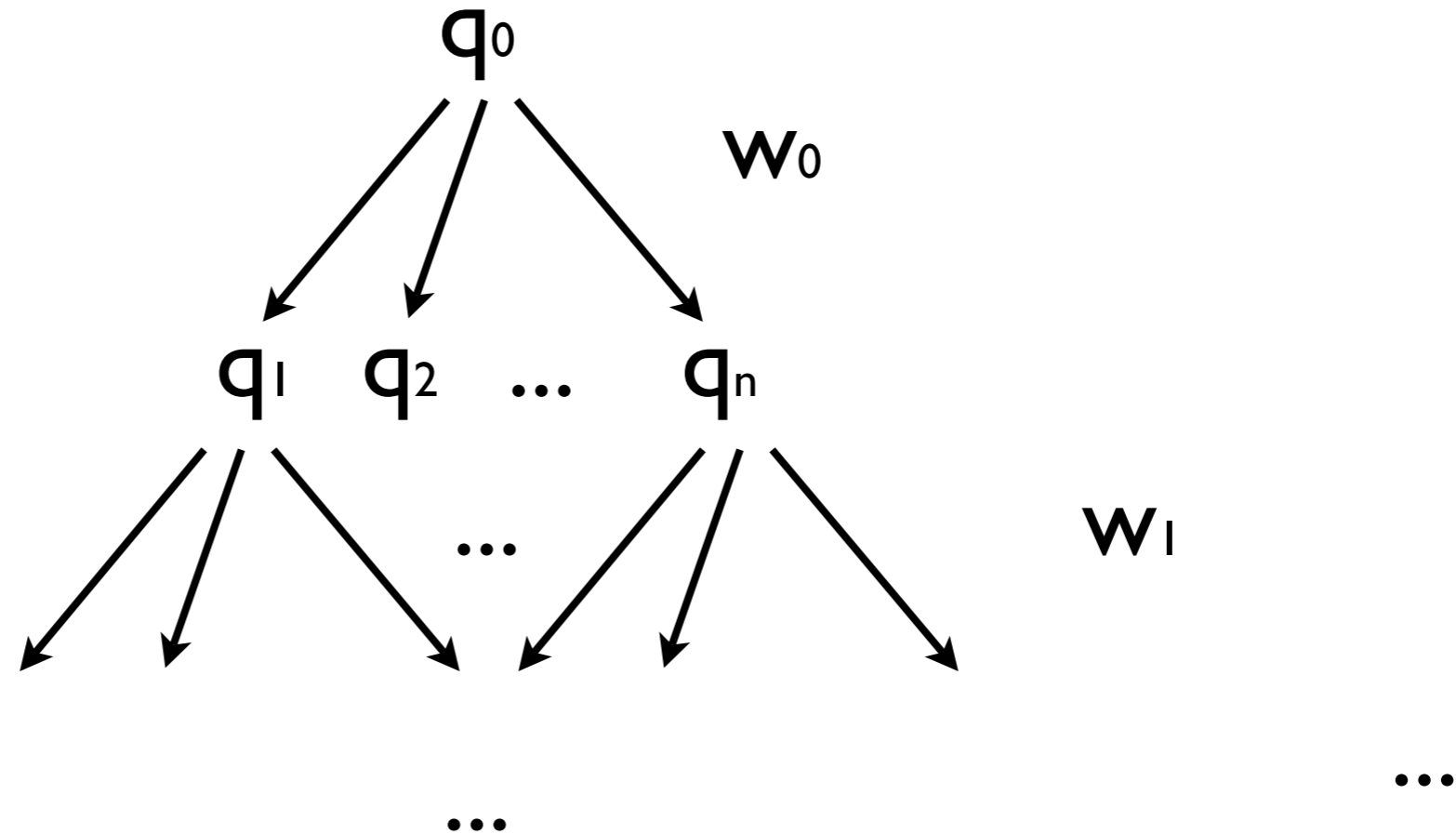
**Choose**  $\{r_1,r_2,\dots,r_m\} \in \delta(q_2,w_1)$   
for each  $q_i$  of previous layer

**Run** of an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$   
on a word  $w=w_0w_1\dots w_n\dots$



The run is **accepting** if every branch intersects **infinitely often**  $\alpha$

**Run** of an **Acobw**  $A=(Q,q_0,\Sigma,\delta,\alpha)$   
on a word  $w=w_0w_1\dots w_n\dots$



The run is **accepting** if every branch intersects **only finitely often**  $\alpha$

# KV construction

Input: A an **NBW**

B an **AcoBW** that accepts the  
**complement** of A

C an **ABW** that accepts the same  
language as B

**Output:** D an **NBW** that accepts the  
same language as C

# KV construction

Input: A an **NBW**

This step is  
trivial  
 $O(1)$

B an **AcoBW** that accepts the  
**complement** of A

C an **ABW** that accepts the same  
language as B

**Output:** D an **NBW** that accepts the  
same language as C

# KV construction

- Let  $A$  be an **NBW** with transition relation  $\delta$  ;
- Let  $B$  be an **AcoBW** identical to  $A$  but with transition relation  $\delta'$  defined as follows: for all  $q \in Q$ : for all  $\sigma \in \Sigma$ :  
**if**  $\delta(q, \sigma) = \{\{q_1\}, \{q_2\}, \dots, \{q_n\}\}$  **then**  $\delta'(q, \sigma) = \{\{q_1, q_2, \dots, q_n\}\}$ ;
- So in  $B$ , we have **dualized** the transition relation: a run of the AcoBW on a word  $w$  is the tree that contains the set of **all** runs of the NBW on  $w$  ;
- ... and the accepting condition:  $B$  has an accepting run (tree) on  $w$  iff all the runs of  $A$  are rejecting ;
- So,  **$B$  accepts the complement of  $A$ .**



# KV construction

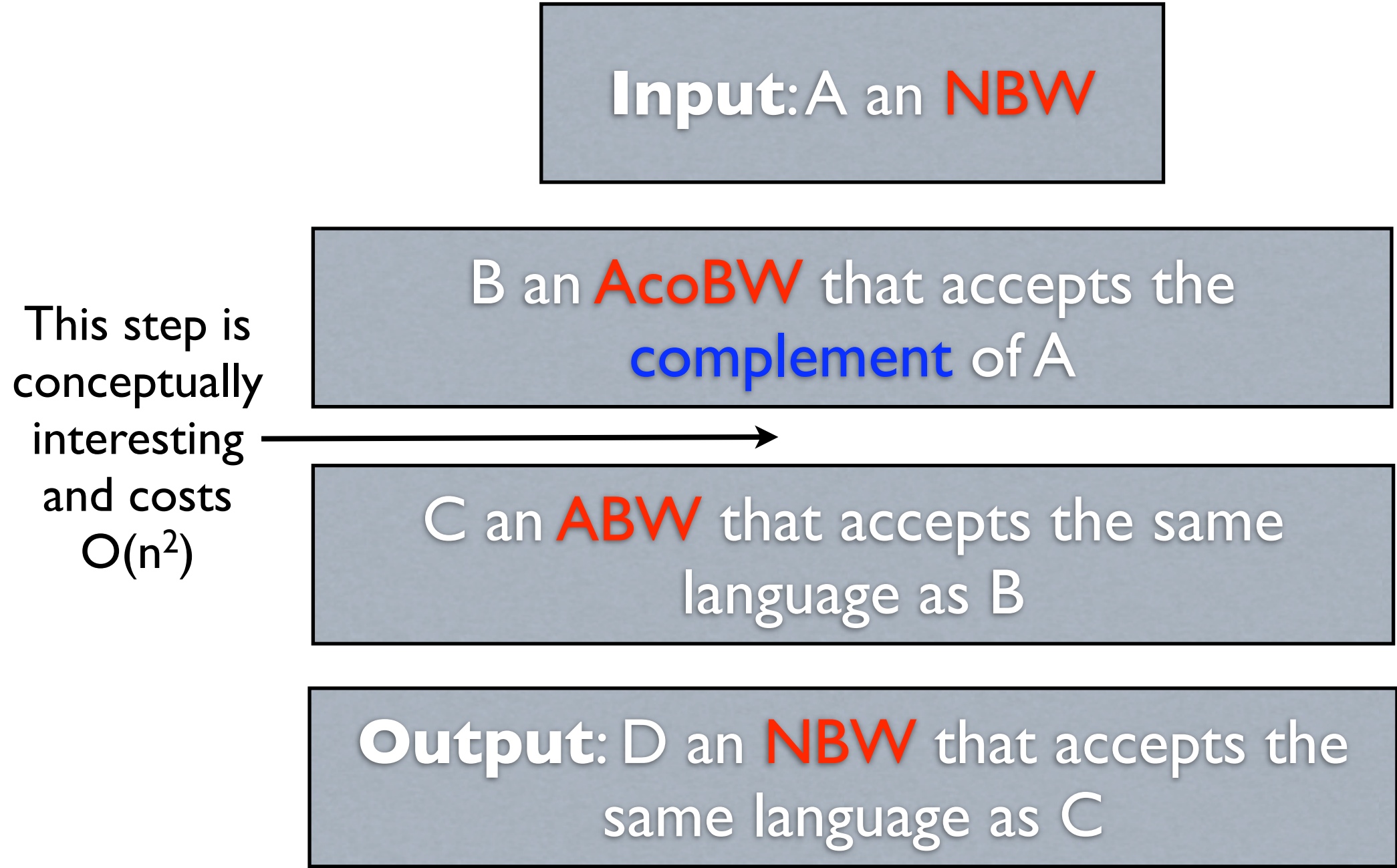
Input: A an **NBW**

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**Output:** D an **NBW** that accepts the  
same language as C

This step is  
conceptually  
interesting  
and costs  
 $O(n^2)$



# Accepting runs of AcoBW

- Accepting runs of AcoBW are **memoryless** (Emerson and Jutla, 1991).
- Memoryless runs are structured and that structure can be exploited to transform an AcoBW **into** an **ABW** (Kupferman and Vardi, 1997).

# KV construction

Input: A an **NBW**

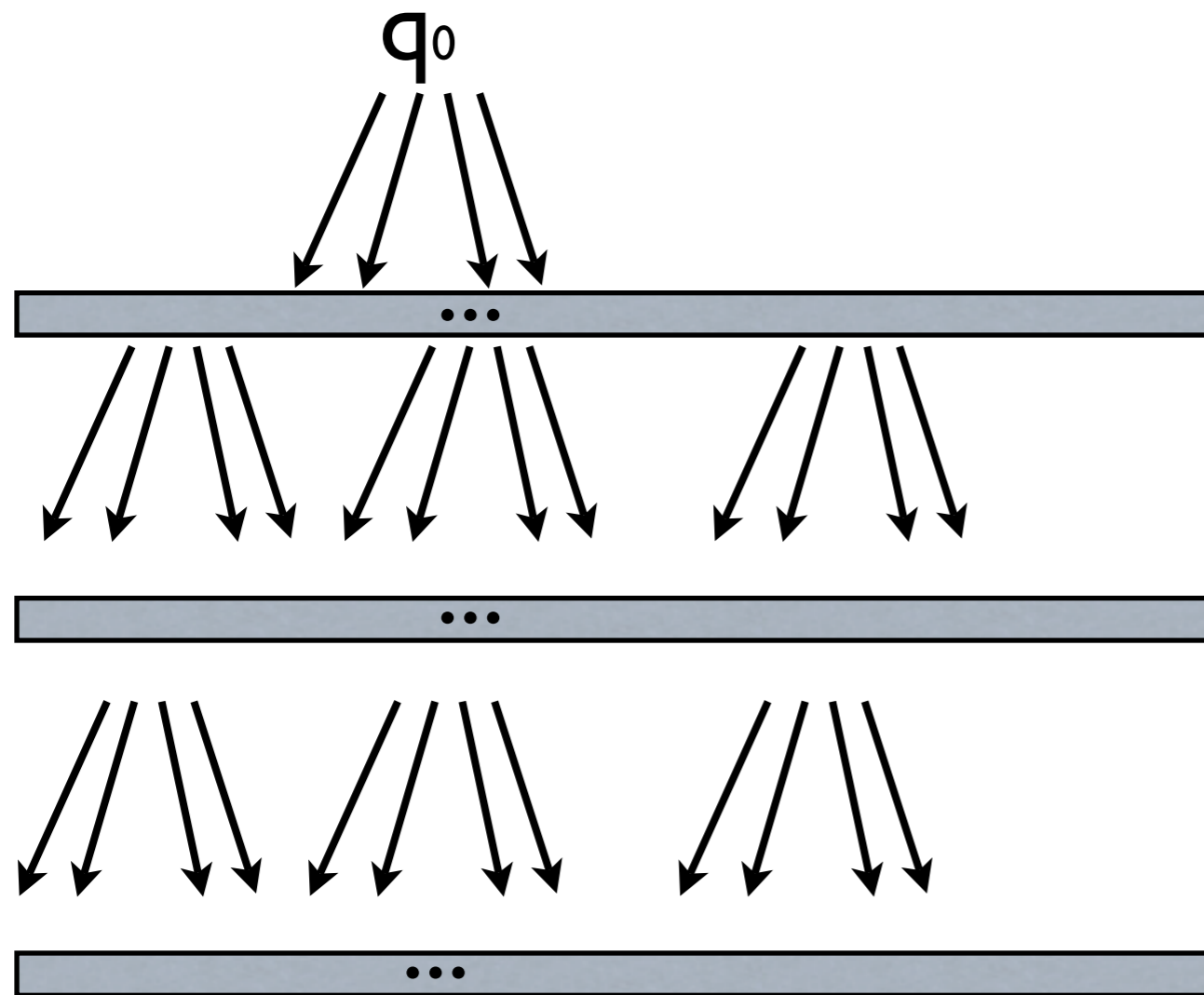
B an **AcoBW** that accepts the  
**complement** of A

C an **ABW** that accepts the same  
language as B

Output: D an **NBW** that accepts the  
same language as C

This step is  
conceptually  
simple but  
costs  
 $2^{O(n)}$

# Accepting runs of ABW



level i: all paths has visited  $\alpha$   
at least once.

level j: all paths has visited  $\alpha$   
at least twice.

...

A NBW can guess a run by maintaining pairs  $(S, O)$ :  
 $S$  states of a level and  $O \subseteq S$  states that need a visit to  $\alpha$ .

# Miyano-Hayashi construction

- Given an ABW  $C=(Q,q_0,\Sigma,\delta,\alpha)$ , the NBW that accepts the same language is given by  $D=(2^Q \times 2^Q, (\{q_0\}, \emptyset), \Sigma, \delta', \alpha')$  where:
  - for any  $(S,O) \in 2^Q \times 2^Q$ , for any  $\sigma \in \Sigma$ :
    - if  $O \neq \emptyset$  then  $\delta'((S,O),\sigma)$  is the set of elements  $\{(S',O' \setminus \alpha)\}$  s.t.  $O' \subseteq S'$ ,  $\forall q \in S: \exists T \in \delta(q, \sigma): T \subseteq S'$ , and  $\forall q \in O: \exists T \in \delta(q, \sigma): T \subseteq O'$ .
    - if  $O = \emptyset$  then  $\delta'((S,O),\sigma)$  is the set of elements  $\{(S',O' \setminus \alpha)\}$  s.t.  $O' = S'$ ,  $\forall q \in S: \exists T \in \delta(q, \sigma): T \subseteq S'$ .
  - $\alpha' = 2^Q \times \{\emptyset\}$

# Miyano-Hayashi construction

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- for any  $(S,0) \in 2^Q \times 2^Q$ , for any  $\sigma \in \Sigma$ :

Unfortunately, this automaton is  
(usually) **huge** as it is constructed on  
the set of locations  
 $2^Q \times 2^Q$

# Miyano-Hayashi construction

- Given an ABW  $C=(Q, \delta, \lambda)$  given by  $D=(2^Q \times 2^Q, \{ \dots \})$
- for any  $(S, 0) \in 2^Q \times 2^Q$

Unfortunately  
(usually) **hu**

the set of locations  
 $2^Q \times 2^Q$

This explains the **poor**  
performances reported for  
current implementations  
of the construction

# But, we do not need explicit complementation ...

- To check **universality** of A, we do **not** need to construct D explicitly;
- ... **we only need** to check if D is **empty** or not;
- ... **similarly** to check inclusion, i.e.  $L(A) \subseteq L(B)$ , we do **not** need to construct the complement of B but we need to check that  $L(A) \cap L^c(B)$  is **empty**.



# But, we do not need explicit complementation ...

- To check **universality** of  $A$ , we do **not** need to construct  $D$  explicitly;
- ... **we only need** to check if  $D$  is **empty** or not:

How can we check **efficiently** the **emptiness** of  $D$  ?

# Emptiness of NBW

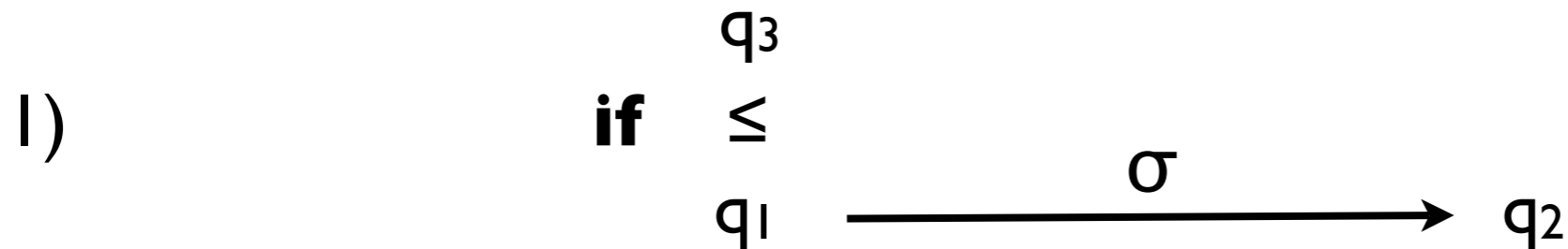
To evaluate **emptiness** of  $A=(Q,q_0,\Sigma,\delta,\alpha)$

Check if

$$q_0 \in \forall y . \mu x . ( \text{Pre}(x) \cup ( \text{Pre}(y) \cap \alpha ) )$$

# Simulation pre-orders and fixed points

Let  $A =$  be a NBW,  
 $\leq \subseteq Q \times Q$  is a **simulation pre-order** iff  
for any  $q_1, q_2, q_3 \in Q$ , for any  $\sigma \in \Sigma$ ,



# Simulation pre-orders and fixed points

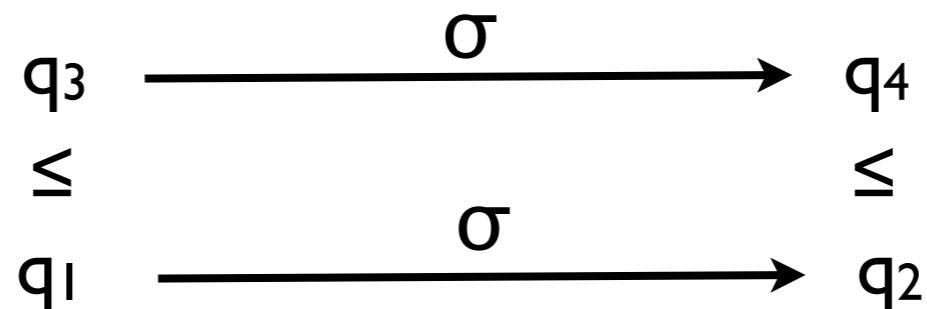
Let  $A =$  be a NBW,  
 $\leq \subseteq Q \times Q$  is a **simulation pre-order** iff

for any  $q_1, q_2, q_3 \in Q$ , for any  $\sigma \in \Sigma$ ,

**then** there exists  $q_4 \in Q$  s.t.:

1)

**if**



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for any  $q_1, q_2, q_3 \in Q$ , for any  $\sigma \in \Sigma$ ,

**then** there exists  $q_4 \in Q$  s.t.:

$$\begin{array}{ccc}
 & & \sigma \\
 & & \longrightarrow \\
 q_3 & \xrightarrow{\quad} & q_4 \\
 \text{1) } & \text{if } \leq & \leq \\
 & & \sigma \\
 & & \longrightarrow \\
 q_1 & \xrightarrow{\quad} & q_2
 \end{array}$$

2) and, for any  $q_1, q_2 \in Q$ : **if**  $q_1 \leq q_2$  and  $q_2 \in \alpha$  **then**  $q_1 \in \alpha$

# Simulation pre-orders and fixed points

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for any  $q_1, q_2, q_3 \in Q$ , for any  $\sigma \in \Sigma$ ,

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$$\begin{array}{ccc}
 & & \sigma \\
 & \xrightarrow{\quad} & \\
 1) \quad & \mathbf{if} & q_3 \xrightarrow{\quad} q_4 \\
 & \leq & \leq \\
 & & \sigma \\
 & q_1 \xrightarrow{\quad} & q_2
 \end{array}$$

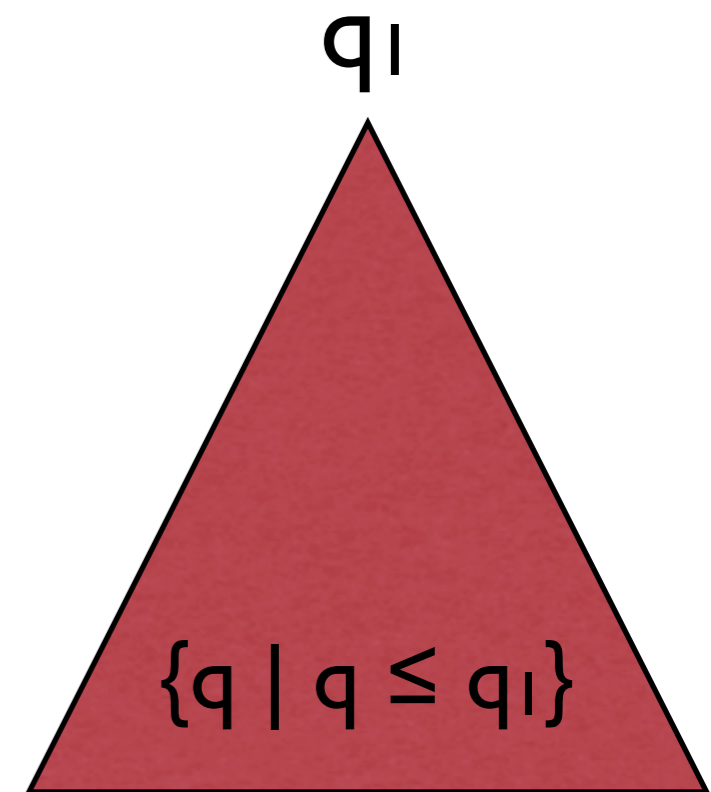
2) and, for any  $q_1, q_2 \in Q$ : **if**  $q_1 \leq q_2$  and  $q_2 \in \alpha$  **then**  $q_1 \in \alpha$

A set  $S \subseteq Q$  is  **$\leq$ -closed** iff  $\forall q_1 \in S : \{q \in Q \mid q \leq q_1\} \subseteq S$

# Simulation pre-orders and fixed points

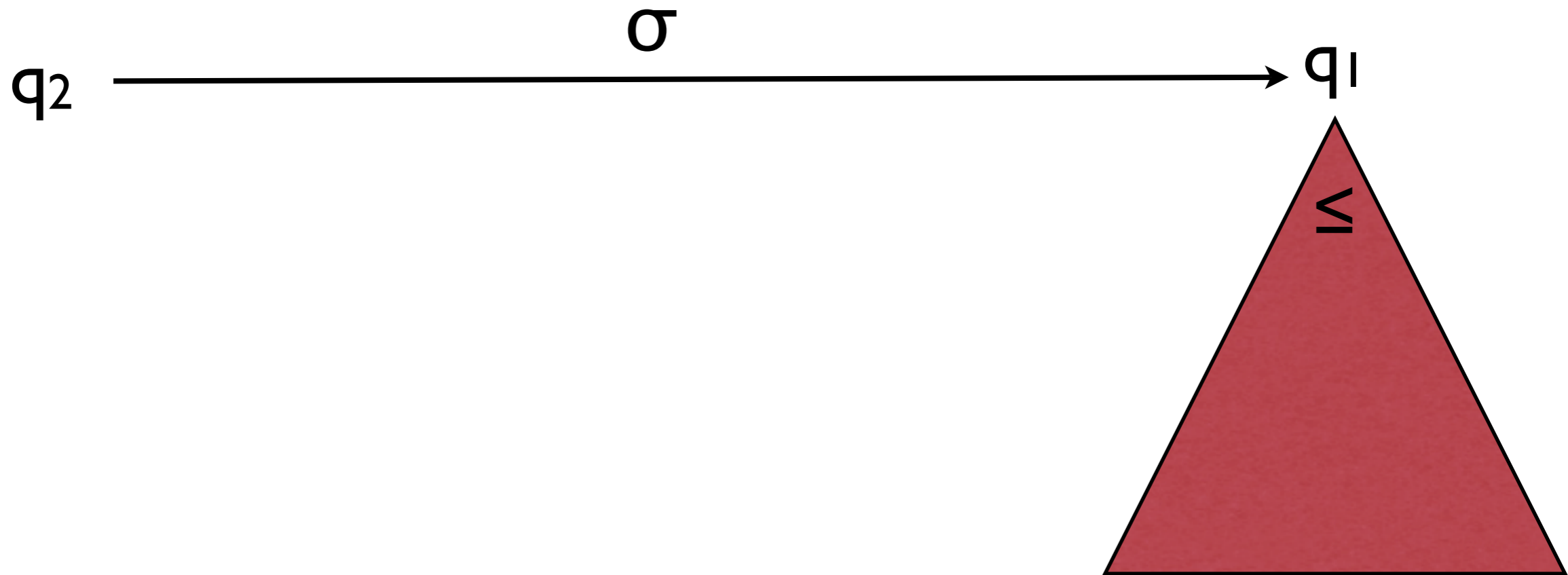
- Lemma: for any NBW  $A=(Q,q_0,\Sigma,\delta,\alpha)$ , for any **simulation pre-order**  $\leq$ , for any  **$\leq$ -closed**  $S,T\subseteq Q$ :
  - (1) for all  $\sigma\in\Sigma$ :  $\text{Pre}(\sigma)(S)$  is  **$\leq$ -closed**;
  - (2)  $S\cup T$  and  $S\cap T$  are  **$\leq$ -closed**;
  - (3)  $\alpha$  is  **$\leq$ -closed**;

# Simulation pre-orders and fixed points

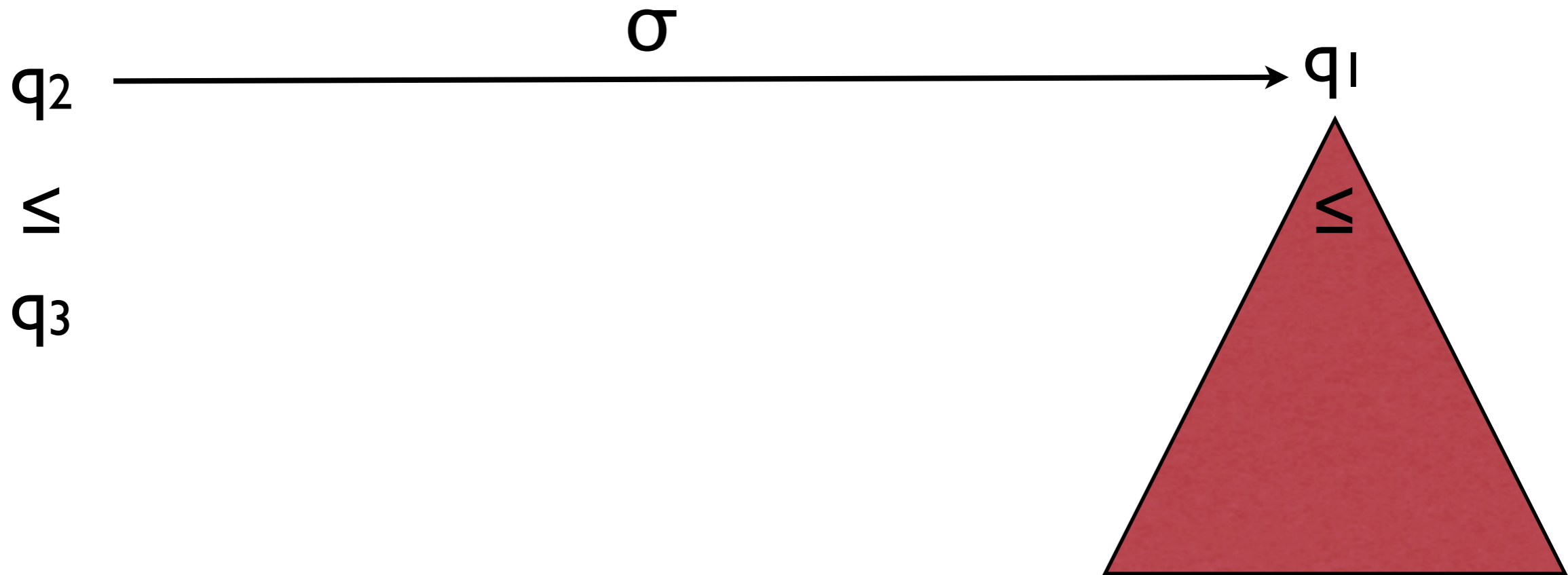




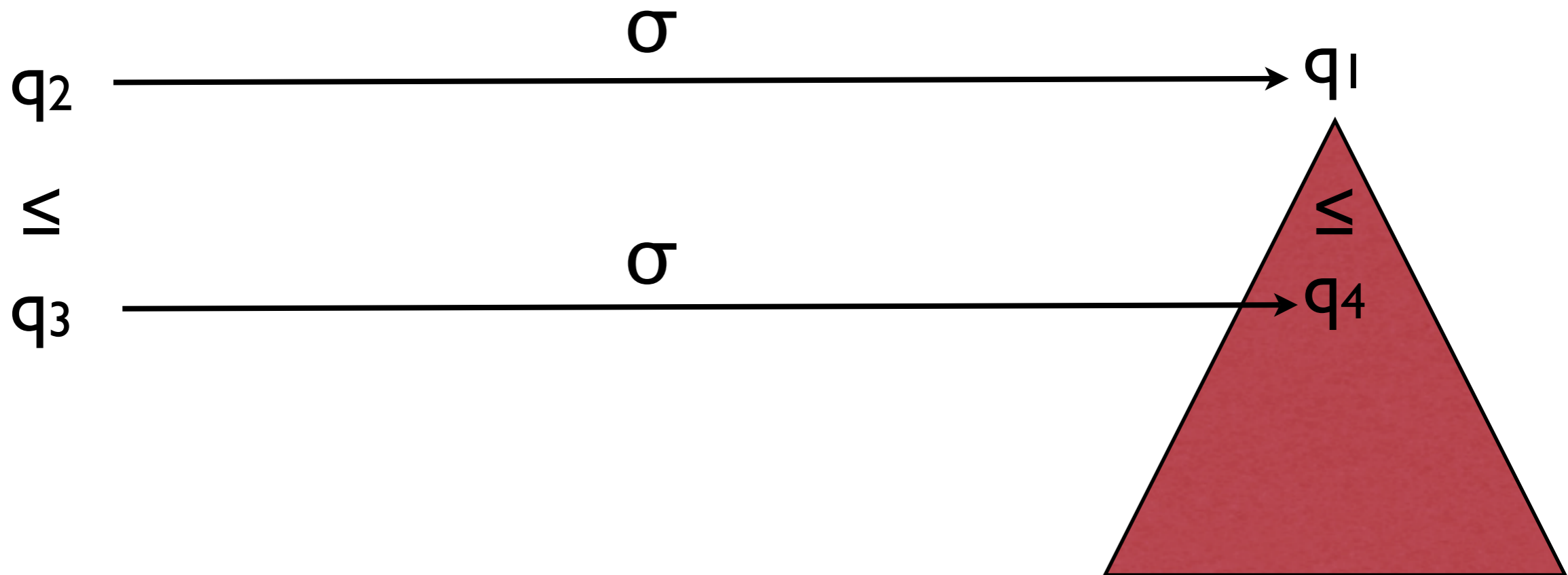
# Simulation pre-orders and fixed points



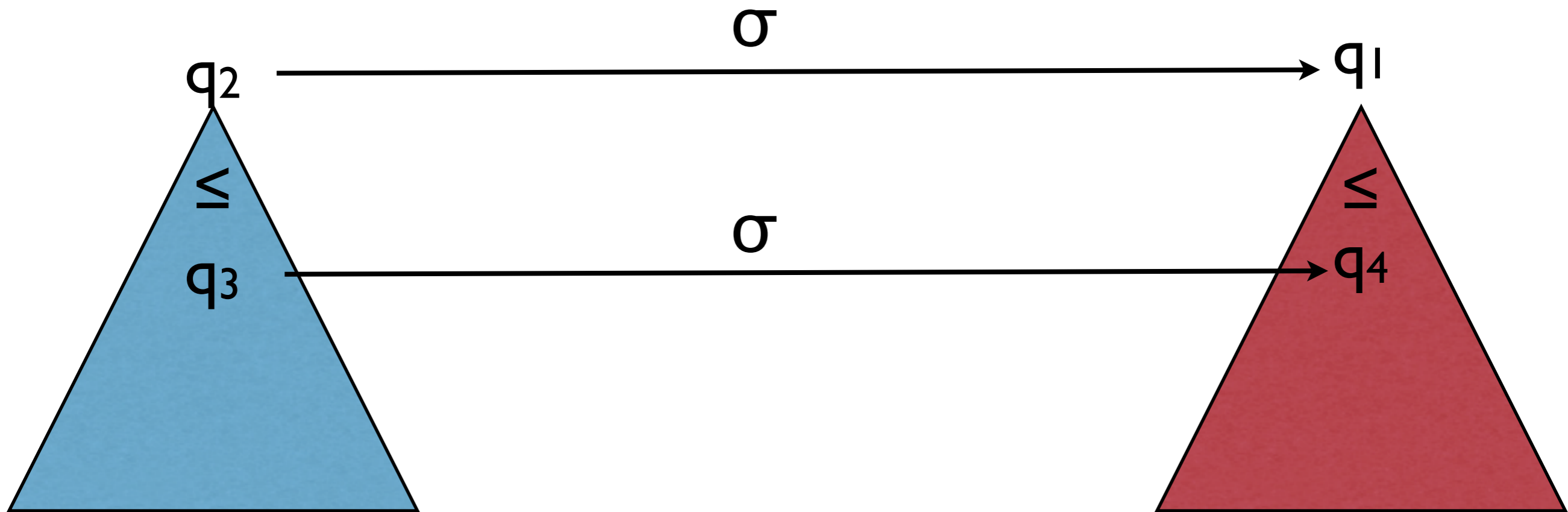
# Simulation pre-orders and fixed points



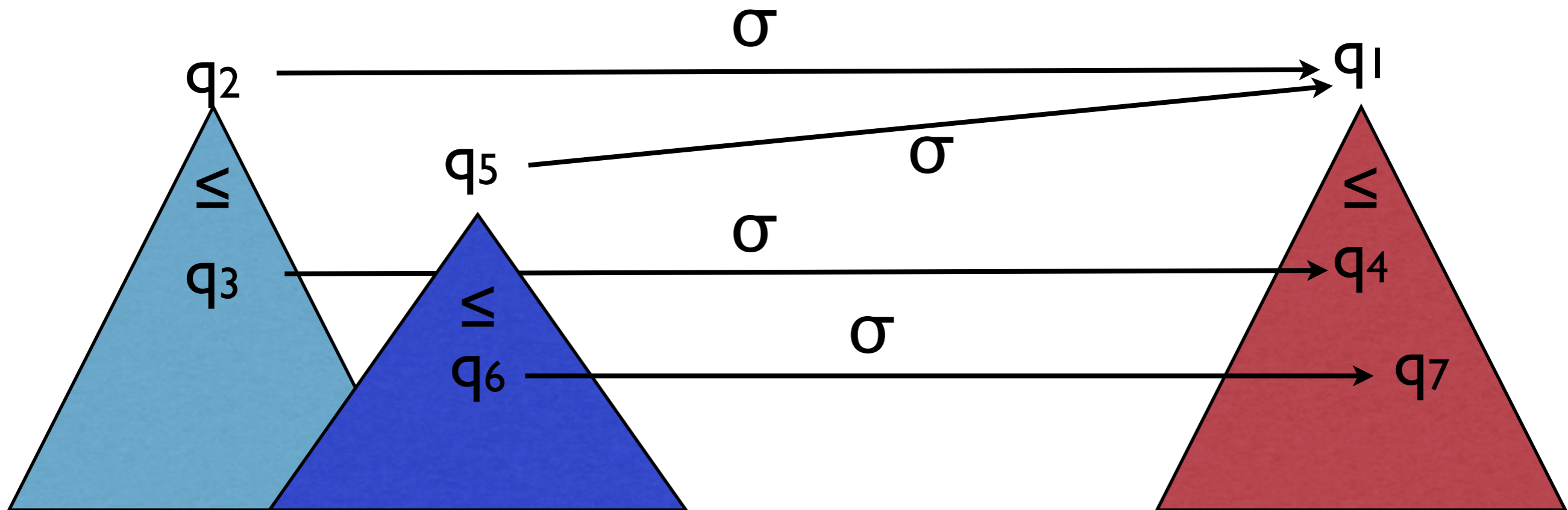
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# Simulation pre-orders and fixed points



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# Simulation pre-orders and fixed points

- Lemma: for any NBW  $A=(Q,q_0,\Sigma,\delta,\alpha)$ , for any **simulation pre-order**  $\leq$ , for any  **$\leq$ -closed**  $S,T\subseteq Q$ :

(I) for all  $\sigma\in\Sigma$ :  $\text{Pre}(\sigma)(S)$  is  **$\leq$ -closed**;

So, all the sets that we manipulate in  
 $\forall y . \mu x . ( \text{Pre}(x) \cup ( \text{Pre}(y) \cap \alpha ) )$   
are  $\leq$ -closed.

# Simulation pre-orders and fixed points

- Lemma: for any NBW  $A=(Q,q_0,\Sigma,\delta,\alpha)$ , for any **simulation pre-order**  $\leq$ , for any  **$\leq$ -closed**  $S \subseteq Q$ :

(I) for  $\leq$ -closed sets can be represented symbolically by their **maximal elements only**;

So, all the sets

$\forall y . \mu x . ( \text{Pre}(x) \cup ( \text{Pre}(y) \cap \alpha ) )$

are  $\leq$ -closed.

# Simulation pre-orders and fixed points

- Lemma: for any **simulation**  $\leq$ -closed

(I) for  $\leq$ -cl

We can potentially compute  $\forall y . \mu x . ( \text{Pre}(x) \cup ( \text{Pre}(y) \cap \alpha ) )$  **more efficiently** by working on maximal elements **only**.

symbolically by their **maximal elements only**

So, all the set

$\forall y . \mu x . ( \text{Pre}(x) \cup ( \text{Pre}(y) \cap \alpha ) )$

are  $\leq$ -closed.



# Good news !

The NBW that results from the KV procedure is equipped **by construction** with a **simulation** pre-order  $\leq$ .

**Idea:** do not construct the huge NBW but check emptiness **directly** and evaluate the fixed point **efficiently** by exploiting the  $\leq$ -**pre-order**.

# Illustration: emptiness of ABW

- Remember that given an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$ , the Miano-Hayashi construction specifies an NBW  $B=(2^Q \times 2^Q, (\{q_0\}, \emptyset), \Sigma, \delta', \alpha')$ .
- The following relation  $\leq \subseteq 2^Q \times 2^Q$  defined by  **$(S,O) \leq (S',O')$  iff (1)  $(O=\emptyset \text{ iff } O'=\emptyset)$  and (2)  $S \subseteq S'$  and  $O \subseteq O'$**  is a **simulation pre-order** on B.
- Note that the  $\leq$ -closure of a pair  $(S,O)$  contains an **exponential number** of elements in the size of S and O!

# Illustration: emptiness of ABW

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- The following relation  $\leq \subseteq 2^Q \times 2^Q$  defined by  **$(S,O) \leq (S',O')$  iff (1)  $(O=\emptyset \text{ iff } O'=\emptyset)$  and (2)  $S \subseteq S'$  and  $O \subseteq O'$**  is a **simulation** p
- Note that the  $\leq$ -closed sets are **exponential nu**

We can check emptiness of B by manipulating  $\leq$ -closed sets represented by their **maximal elements only**.

# Illustration: emptiness of ABW

- Remember that given an ABW  $A=(Q,q_0,\Sigma,\delta,\alpha)$ , the Miano-Hayashi construction specifies an

This potentially saves us an  
**exponential!**

**exponential nu**

ed by

nd (2)  $S \subseteq S'$  and  $O \subseteq O'$

emptiness of B by  
 $\leq$ -closed sets  
represented by their **maximal  
elements only.**

# Illustration: emptiness of ABW

- Remember that given a Hayashi construction

This potentially  
**exponential**

**exponential number**

We have a **polynomial** time algorithm that given  $(S, O)$  and  $\sigma \in \Sigma$ , compute a compact representation of  **$\text{Pre}(\sigma)(\downarrow(S, O))$**

emptiness of  $B$  by  $\leq$ -**closed sets** represented by their **maximal elements only.**

# Practical evaluation Universality

Input: A an **NBW**

Implicit

B an **AcoBW** that accepts the  
**complement** of A

Implicit

C an **ABW** that accepts the same  
language as B

Implicit

**Output:** D an **NBW** that accepts the  
same language as C

# Practical evaluation Universality

Input: A an **NBW**

Implicit

We evaluate the fixed point for emptiness directly, that is, **without** constructing the automaton specified by the construction.

Implicit

We evaluate this fixed point by manipulating  $\leq$ -**closed** sets through their **maximal elements only**.

Implicit

# Practical evaluation

- We have implemented our new algorithm to check universality of NBW;
- Evaluation on a **randomized model** proposed by Tabakov and Vardi (2005) that generates random NBW (two parameters:  $r, f$ );
- On that randomized model Tabakov's BDD implementation can handle **6 states** on the most difficult instances with median time **<20s**.



# Practical evaluation

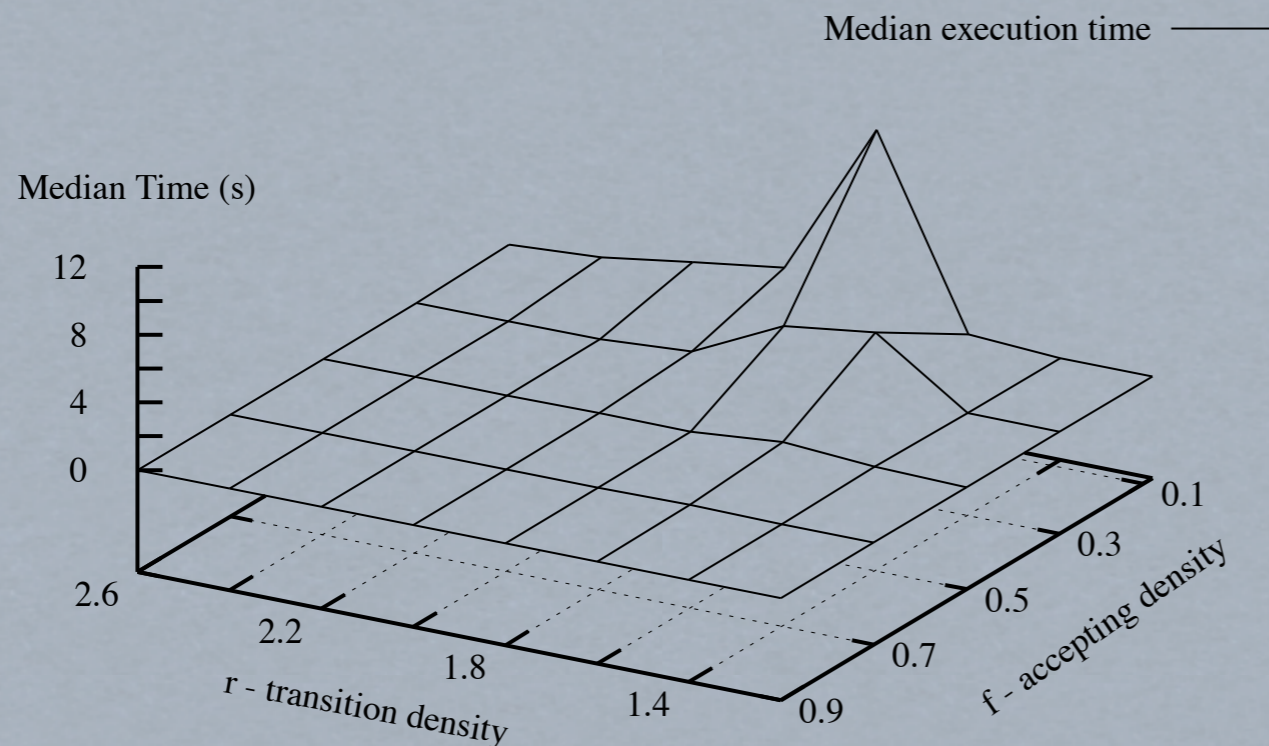
## Universality

**Table 1.** Automata size for which the median execution time for checking universality is less than 20 seconds. The symbol  $\infty$  means *more than 1500*.

$f \backslash r$	0.2	0.4	0.6	0.8	1.0	1.2	1.4	1.6	1.8	2.0	2.2	2.4	2.6	2.8	3.0
0.1	$\infty$	$\infty$	$\infty$	550	200	120	60	40	30	40	50	50	70	90	100
0.3	$\infty$	$\infty$	$\infty$	500	200	100	40	30	40	70	100	120	160	180	200
0.5	$\infty$	$\infty$	$\infty$	500	200	120	60	60	90	120	120	120	140	260	500
0.7	$\infty$	$\infty$	$\infty$	500	200	120	70	80	100	200	440	1000	$\infty$	$\infty$	$\infty$
0.9	$\infty$	$\infty$	$\infty$	500	180	100	80	200	600	$\infty$	$\infty$	$\infty$	$\infty$	$\infty$	$\infty$

For  $r=2$ ,  $f=0.5$ , Tabakov can handle **8** states while our algorithm handles **120** states in less than 20s.

# Practical evaluation Universality



**Fig. 1.** Median time to check universality of 100 automata of size 30 for each sample point.

To compare, Tabakov's BDD implementation was able to handle automata of size **6** on the entire state space (within 20s as in our experiments).

# Conclusions

- In the automata-based approach to model-checking: keep **implicit** the complementation step and check for emptiness efficiently by exploiting **simulation pre-orders** that exists by **construction** ;
- Implementation for **universality** problem shows promising results: **several orders of magnitude** on the randomized model !

# Future Works

- Implement and evaluate the new **language inclusion** algorithm ;
- Evaluate beyond the randomized model ;
- Revisit the **LTL** model-checking problem: do not construct the **NBW** of the negation of the formula but use **ABW** and check directly for **emptiness**.