

# CS420

## Introduction to the Theory of Computation

### Lecture 3: Nondeterministic Finite Automaton

Tiago Cogumbreiro

# How do you generate $M_1 \cup M_2$ ?

What does this code tells us?

```

def union(dfa1, dfa2):
    def transition(q, a):
        return (dfa1.transition_func(q[0], a), dfa2.transition_func(q[1], a))

    def is_final(q):
        return dfa1.accepted_states(q[0]) or dfa2.accepted_states(q[1])

    return DFA(
        states = set(product(dfa1.states, dfa2.states)),
        alphabet = set(dfa1.alphabet).union(dfa2.alphabet),
        transition_func = transition,
        start_state = (dfa1.start_state, dfa2.start_state),
        accepted_states = is_final
    )
  
```

# Mathematically...

The union operation is defined as  $\text{union}(M_1, M_2) = (Q_{1,2}, \Gamma_1, \delta_{1,2}, q_{1,2}, F_{1,2})$  where

- $M_1 = (Q_1, \Gamma_1, \delta_1, q_1, F_1)$
- $M_2 = (Q_2, \Gamma_2, \delta_2, q'_1, F_2)$
- **States:**  $Q_{1,2} = Q_1 \times Q_2$
- **Alphabet:**  $\Gamma_1 = \Gamma_2$
- **Transition:**  $\delta_{1,2}(q, a) = (\delta_1(q|_1, a), \delta_2(q|_2, a))$
- **Initial:**  $q_{1,2} = (q_1, q'_1)$
- **Final:**  $F_{1,2} = \{q \mid q|_1 \in F_1 \vee q|_2 \in F_2\}$

Let notation  $q|_1 = x$  be defined when  $q = (x, y)$ . Let notation  $q|_2 = y$  be defined when  $q = (x, y)$ .

# The key point is the transition function

- **Transition:**  $\delta_{1,2}(q, a) = (\delta_1(q|_1, a), \delta_2(q|_2, a))$

How do we fill a transition table?

1. For every  $q \in Q_1 \times Q_2$  and for every  $a \in \Gamma_1$
2. The cell in line  $q$  and column  $a$  becomes  $(\delta_1(q|_1, a), \delta_2(q|_2, a))$

How do we draw the state diagram?

1. Start from the initial state  $q_1$  and for each  $a \in \Sigma$  draw an edge to each state  $q_2 = \delta(q_1, a)$
2. While there are states without outgoing edges, pick one state  $q_i$  without outgoing edges: for each  $a \in \Sigma$  draw an edge to state  $q'_i = \delta(q_i, a)$

	<i>I</i>	<i>O</i>	<i>H</i>
(undef, undef)	(undef, undef)	(undef, undef)	(undef, undef)
(undef, init)	(undef, undef)	(undef, undef)	(undef, H)
(H, H)	(HI, undef)	(undef, HO)	(undef, undef)
(HI, HO)	(undef, undef)	(undef, undef)	(undef, undef)
(H, HO)	(HI, undef)	(undef, undef)	(undef, undef)
(HI, H)	(undef, undef)	(undef, HO)	(undef, undef)
(init, undef)	(undef, undef)	(undef, undef)	(H, undef)
(H, undef)	(HI, undef)	(undef, undef)	(undef, undef)
(HI, init)	(undef, undef)	(undef, undef)	(undef, H)
(init, HO)	(undef, undef)	(undef, undef)	(H, undef)
(undef, H)	(undef, undef)	(undef, HO)	(undef, undef)
(init, H)	(undef, undef)	(undef, HO)	(H, undef)
(HI, undef)	(undef, undef)	(undef, undef)	(undef, undef)
(H, init)	(HI, undef)	(undef, undef)	(undef, H)
(init, init)	(undef, undef)	(undef, undef)	(H, H)
(undef, HO)	(undef, undef)	(undef, undef)	(undef, undef)

# Today we will learn

- Non-deterministic Finite Automata (NFA)
- Nondeterministic transitions
- Epsilon transitions
- Formalizing acceptance
- Converting from NFA to DFA

## Section 1.2

# Today's lecture

- motivate, introduce NFAs informally (using state diagrams)
- define NFAs mathematically
- define NFAs algorithmically
- present the relationship between NFAs and DFAs

# Exercise 1

Let  $\Sigma = \{a, b\}$ . Give a DFA with **four** states that recognizes the following language

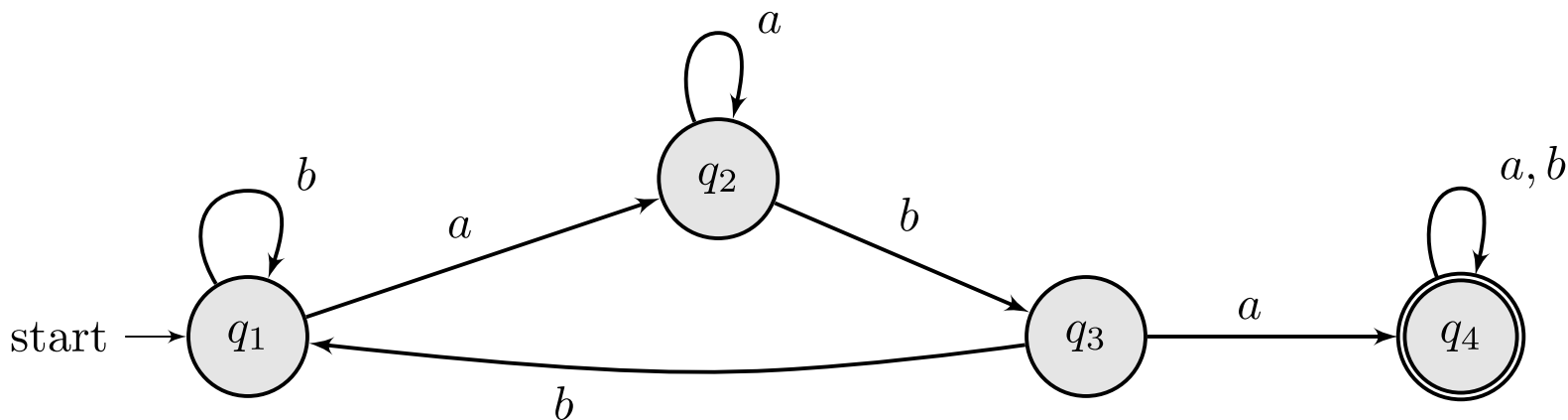
$$\{w \mid w \text{ contains the string } aba\}$$



# Exercise 1

Let  $\Sigma = \{a, b\}$ . Give a DFA with **four** states that recognizes the following language

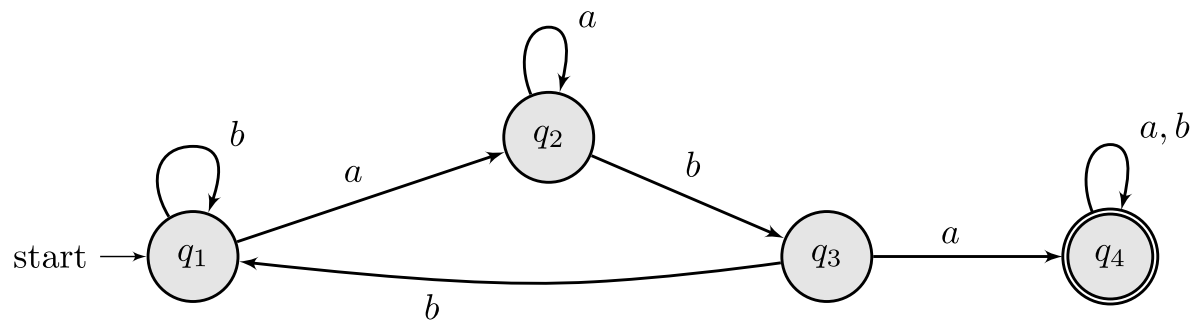
$$\{w \mid w \text{ contains the string } aba\}$$



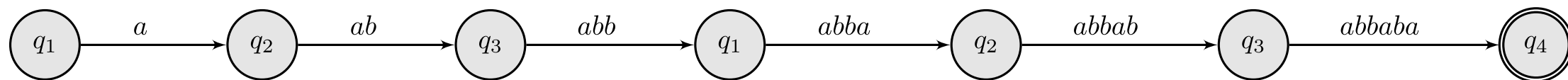
# Acceptance in a DFA

## Acceptance is path finding

The given string must follow a path from the starting node into an accepting node.



## Acceptance of abbaba



# DFA summary

- simple to analyze because each transition is deterministic
- implementing a DFA is quite trivial (because of the above)
- not very intuitive to design, because they are also limited
- each states must have a transition for all inputs (verbosity)
- using sink states to represent inputs we want to reject (verbosity)

# Introducing Nondeterministic Finite Automata (NFA)

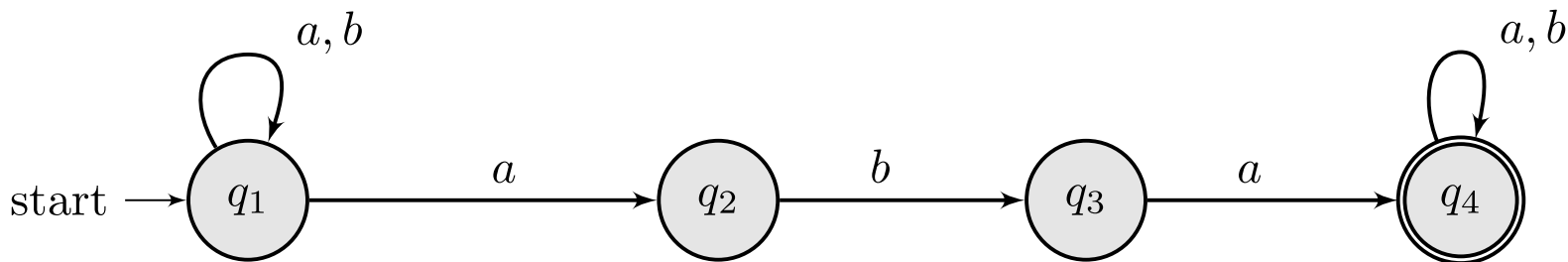
# Introducing NFAs

- harder to analyze due to nondeterminism
- harder to implement (because of the above)
- may be more intuitive to design
- states may omit transitions they do not care
- sink states are unneeded

# Exercise 1 with an NFA

Let  $\Sigma = \{a, b\}$ . Give an NFA with **four states** that recognizes the following language

$$\{w \mid w \text{ contains the string } aba\}$$

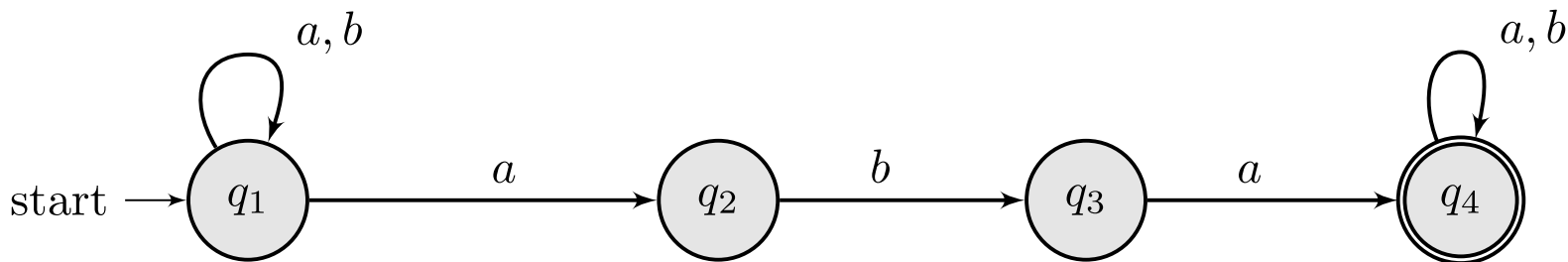


State diagram differences versus DFA?

# Exercise 1 with an NFA

Let  $\Sigma = \{a, b\}$ . Give an NFA with **four states** that recognizes the following language

$$\{w \mid w \text{ contains the string } aba\}$$



State diagram differences versus DFA?

- **Nondeterminism:**  $q_1$  may transition via  $a$  to  $q_1$  and also to  $q_2$

$$q_1 \xrightarrow{a} q_1 \text{ and } q_1 \xrightarrow{a} q_2$$

- **Absent transitions:** state  $q_2$  is missing an outgoing edge labelled by  $a$ !

$$q_2 \xrightarrow{b} q_3 \text{ and } q_2 \not\xrightarrow{a}$$

# Acceptance in an NFA

## Acceptance is path finding

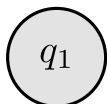
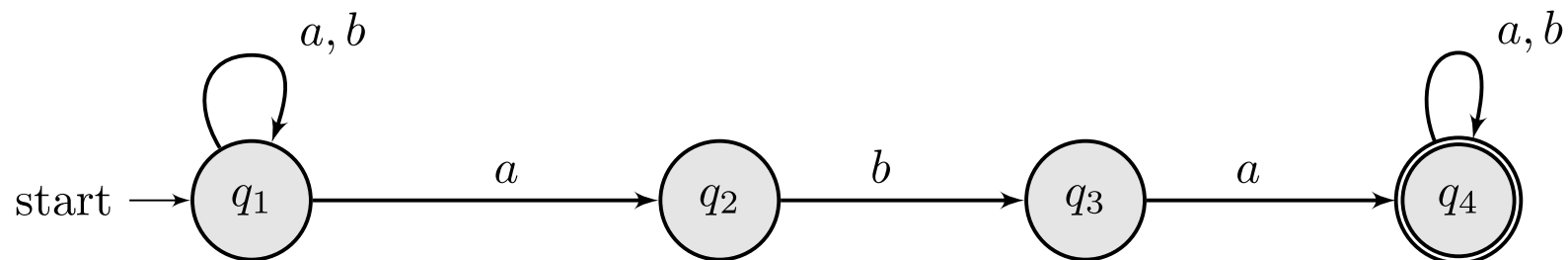
The given string must be a path from the starting node into the accepting node.

■ NFAs can have **multiple** possible paths because of nondeterminism, contrary to DFAs!



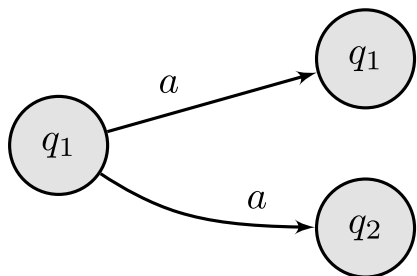
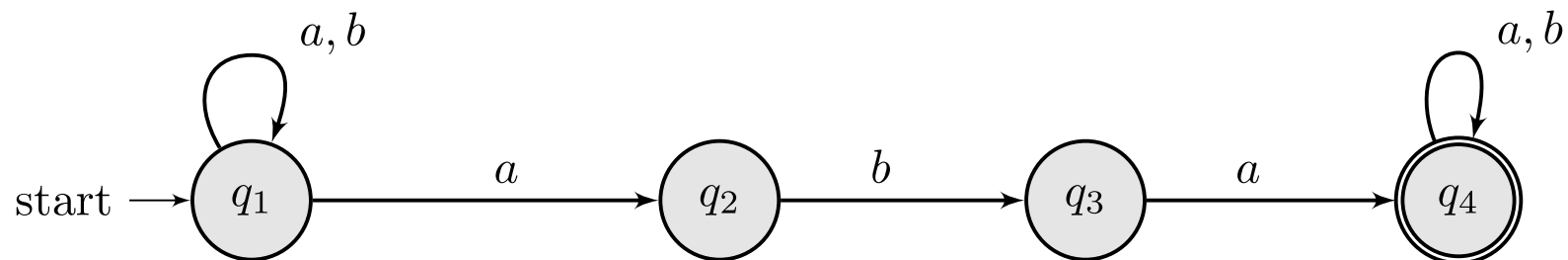
# Acceptance in an NFA

Acceptance of **a**bbaba



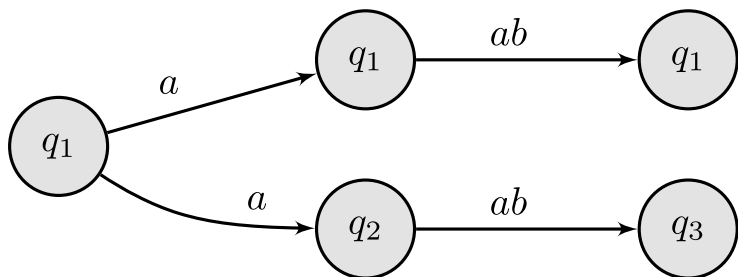
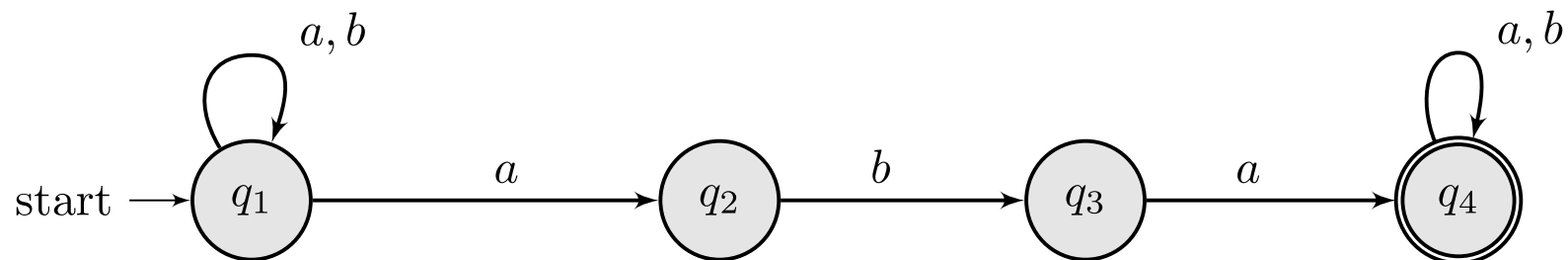
# Acceptance in an NFA

Acceptance of **a**bbaba



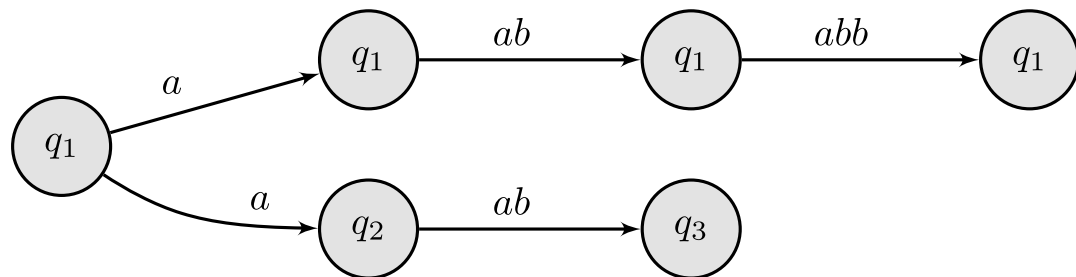
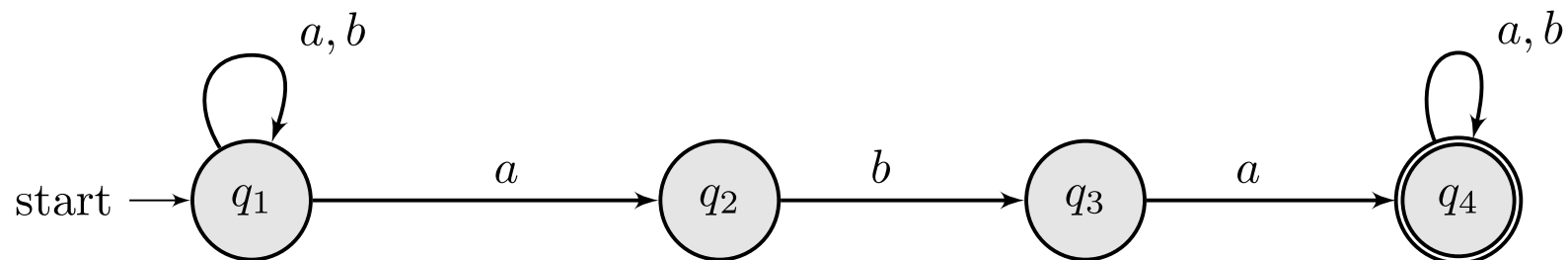
# Acceptance in an NFA

Acceptance of ab**b**aba



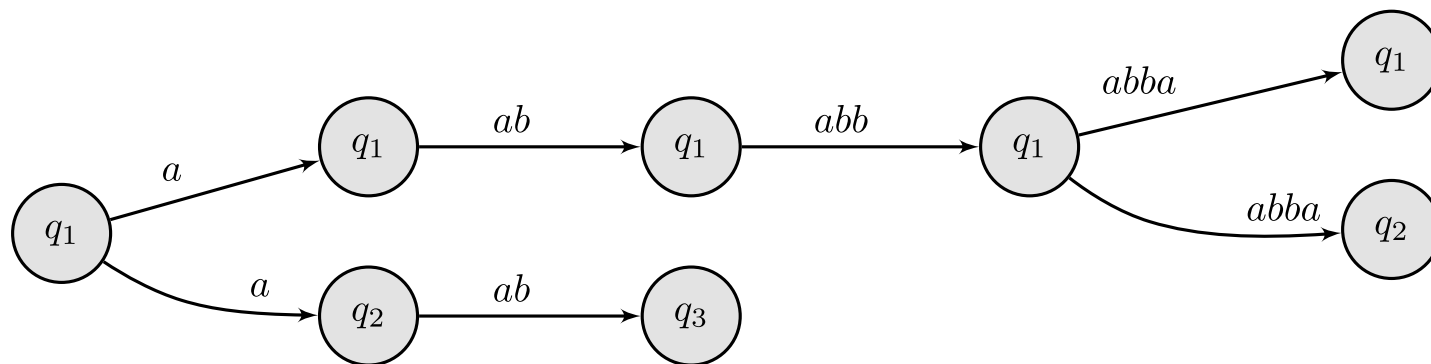
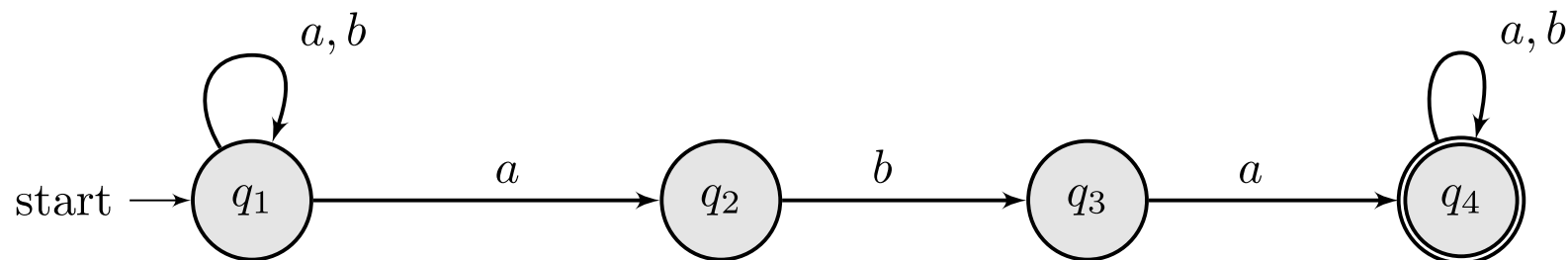
# Acceptance in an NFA

Acceptance of **abba**



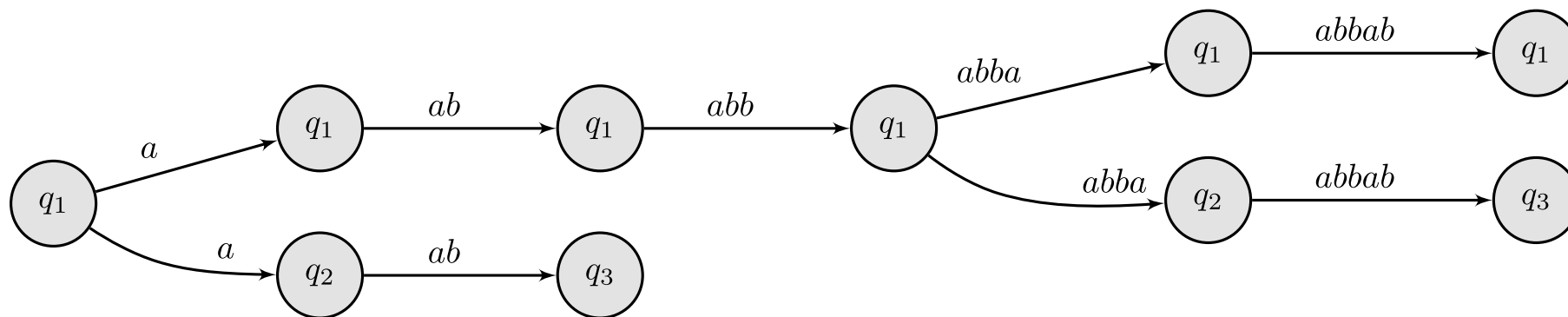
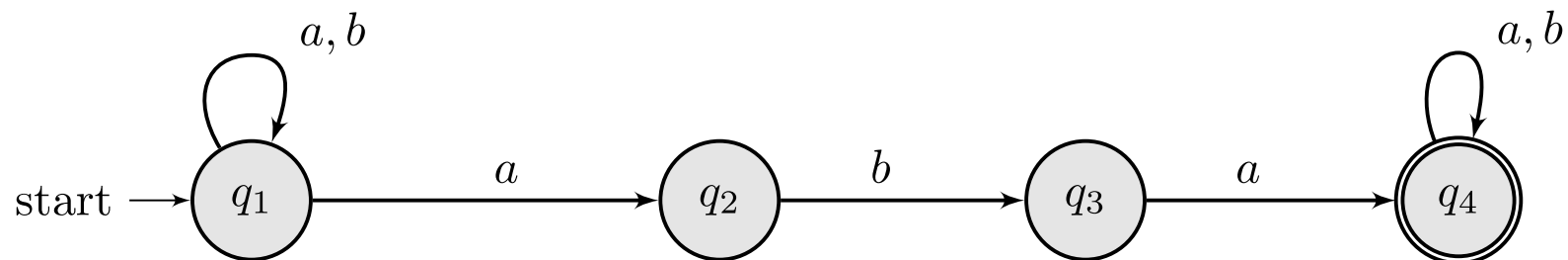
# Acceptance in an NFA

Acceptance of **abba**



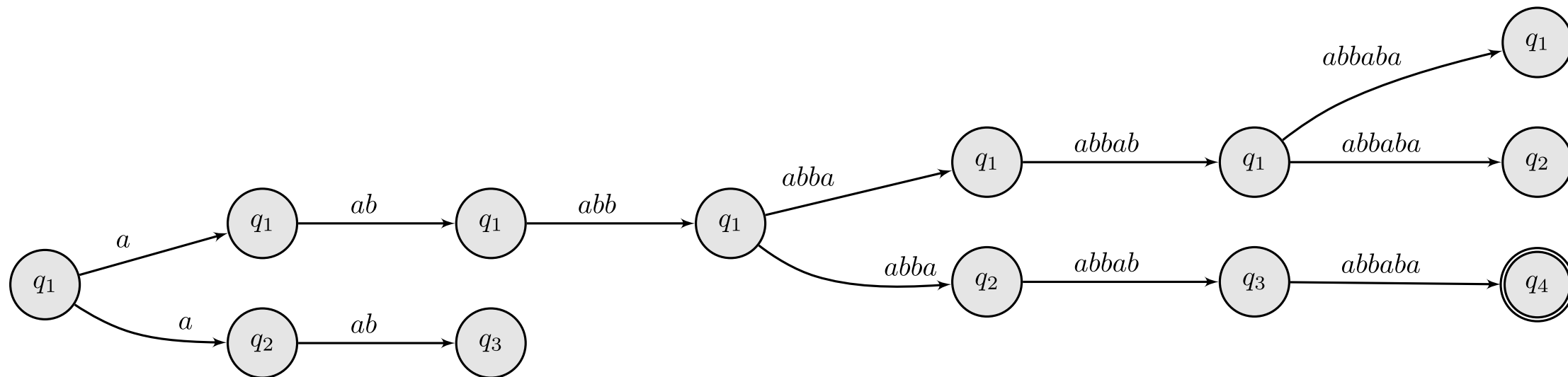
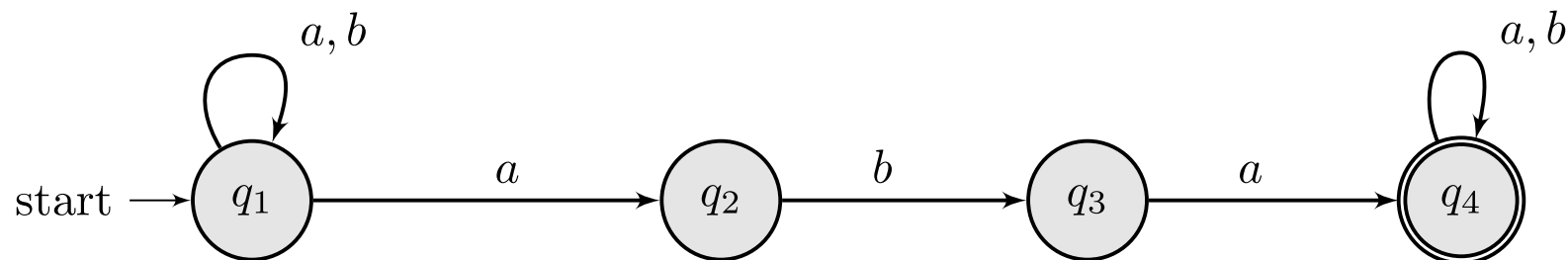
# Acceptance in an NFA

Acceptance of  $abbab\mathbf{a}$



# Acceptance in an NFA

Acceptance of abbaba



# Acceptance in an NFA

- There are multiple concurrent possible paths and a current state
- Given a current state, if there are no transitions for a given input, the path ends
- Once we reach the final path, we check if there are accepting states



# Exercise 2

# Exercise 2

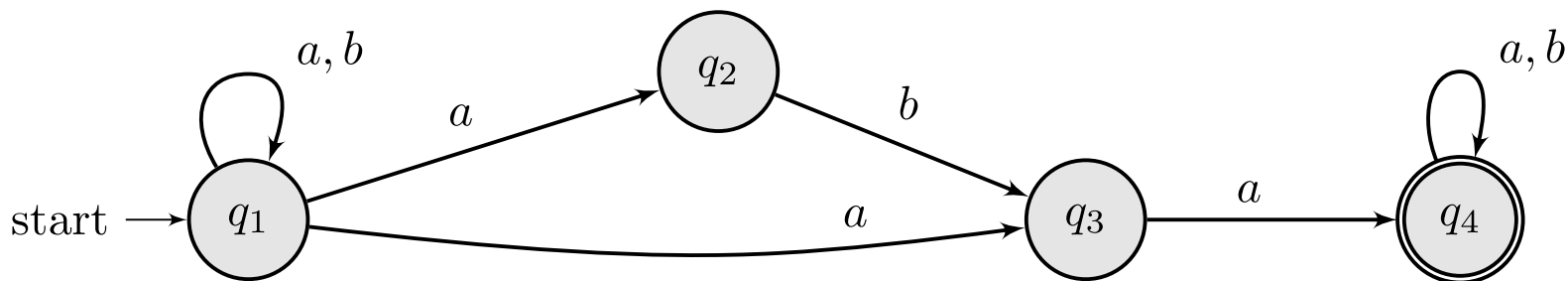
Let  $\Sigma = \{a, b\}$ . Give an NFA with **four states** that recognizes the following language

$$\{w \mid w \text{ contains the strings } aba \text{ or } aa\}$$

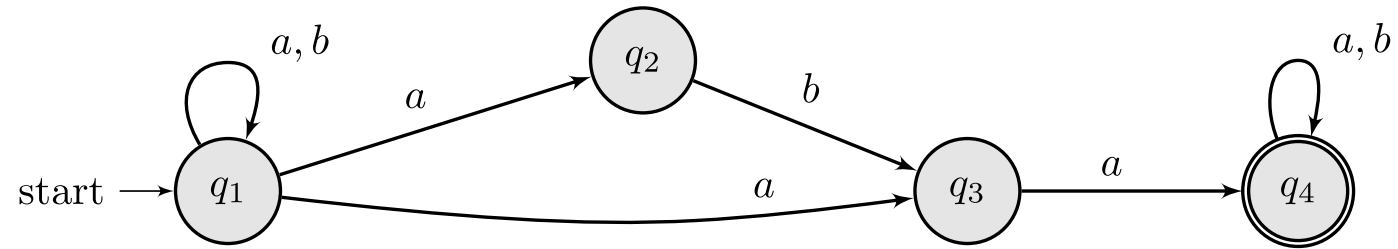
# Exercise 2

Let  $\Sigma = \{a, b\}$ . Give an NFA with **four states** that recognizes the following language

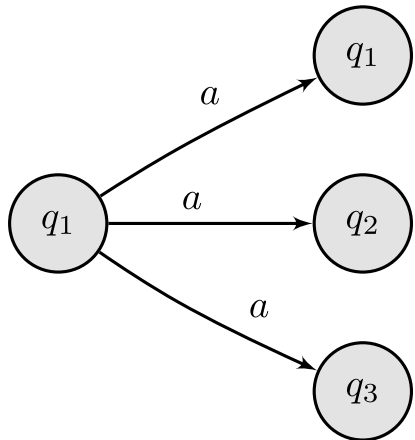
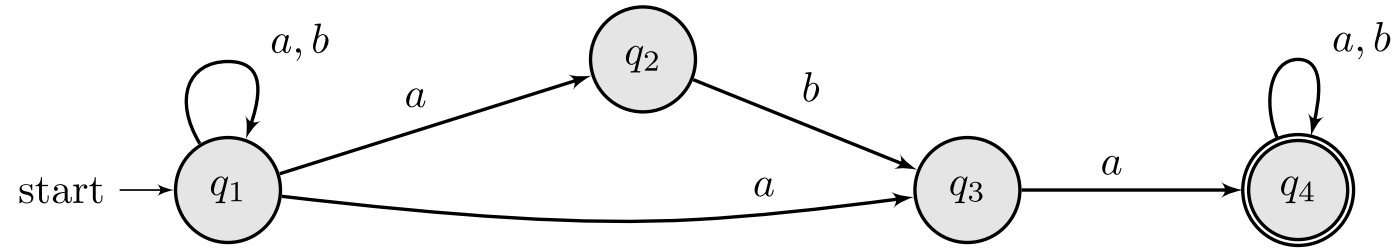
$\{w \mid w \text{ contains the strings } aba \text{ or } aa\}$



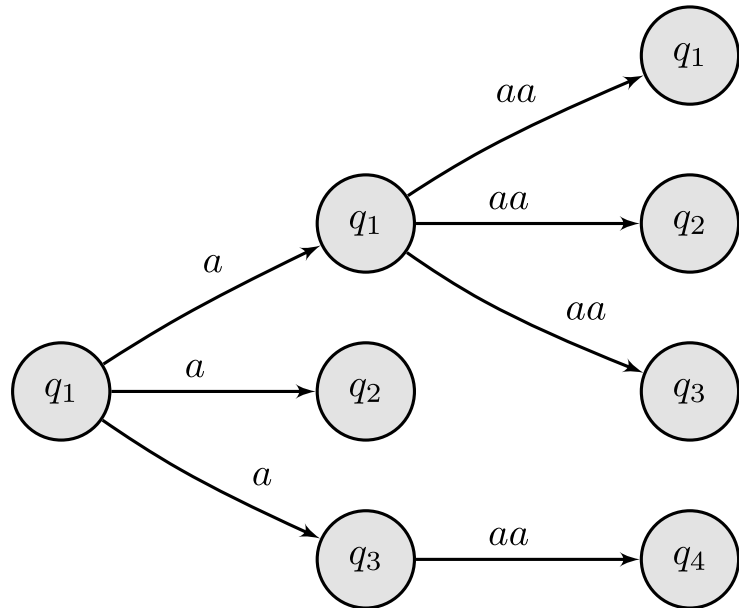
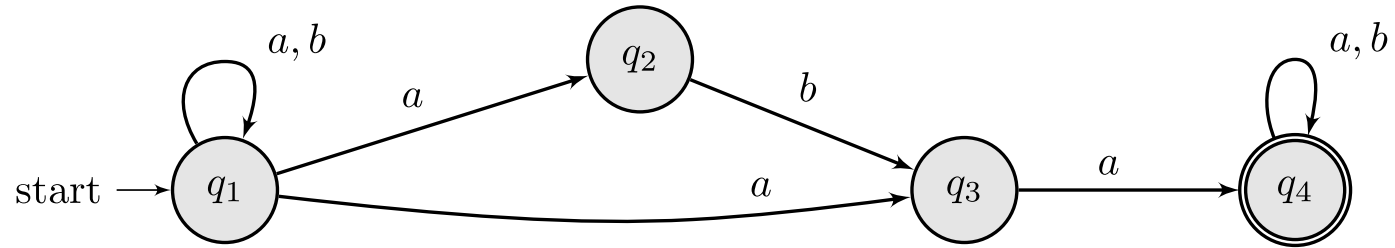
## Exercise 2: acceptance of **a**aba



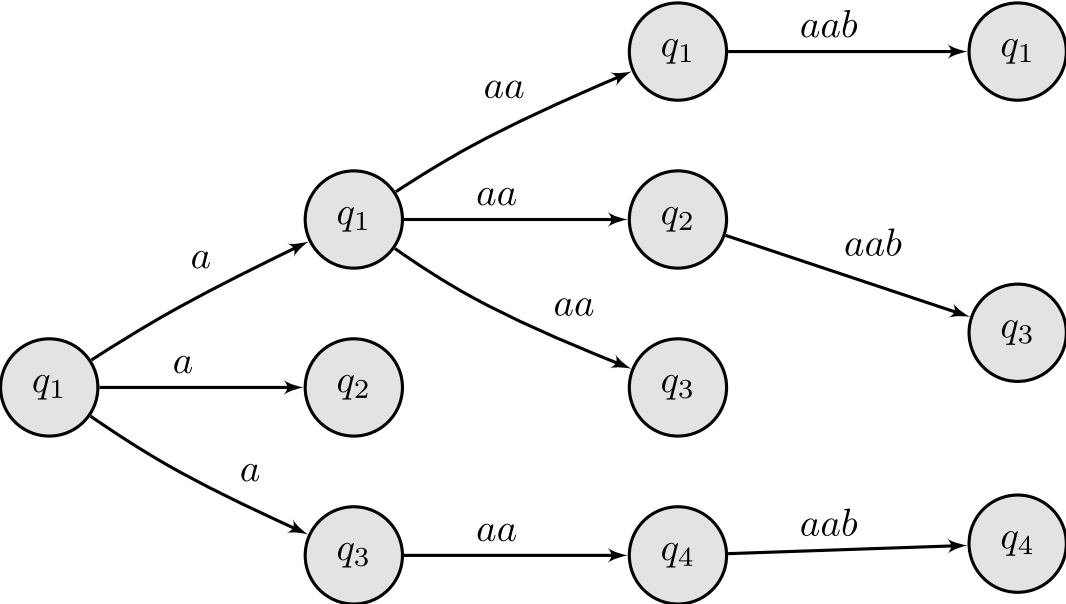
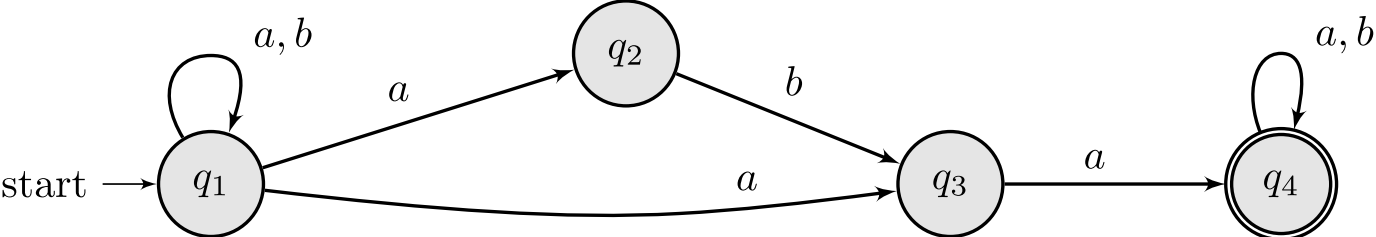
## Exercise 2: acceptance of **a**ba



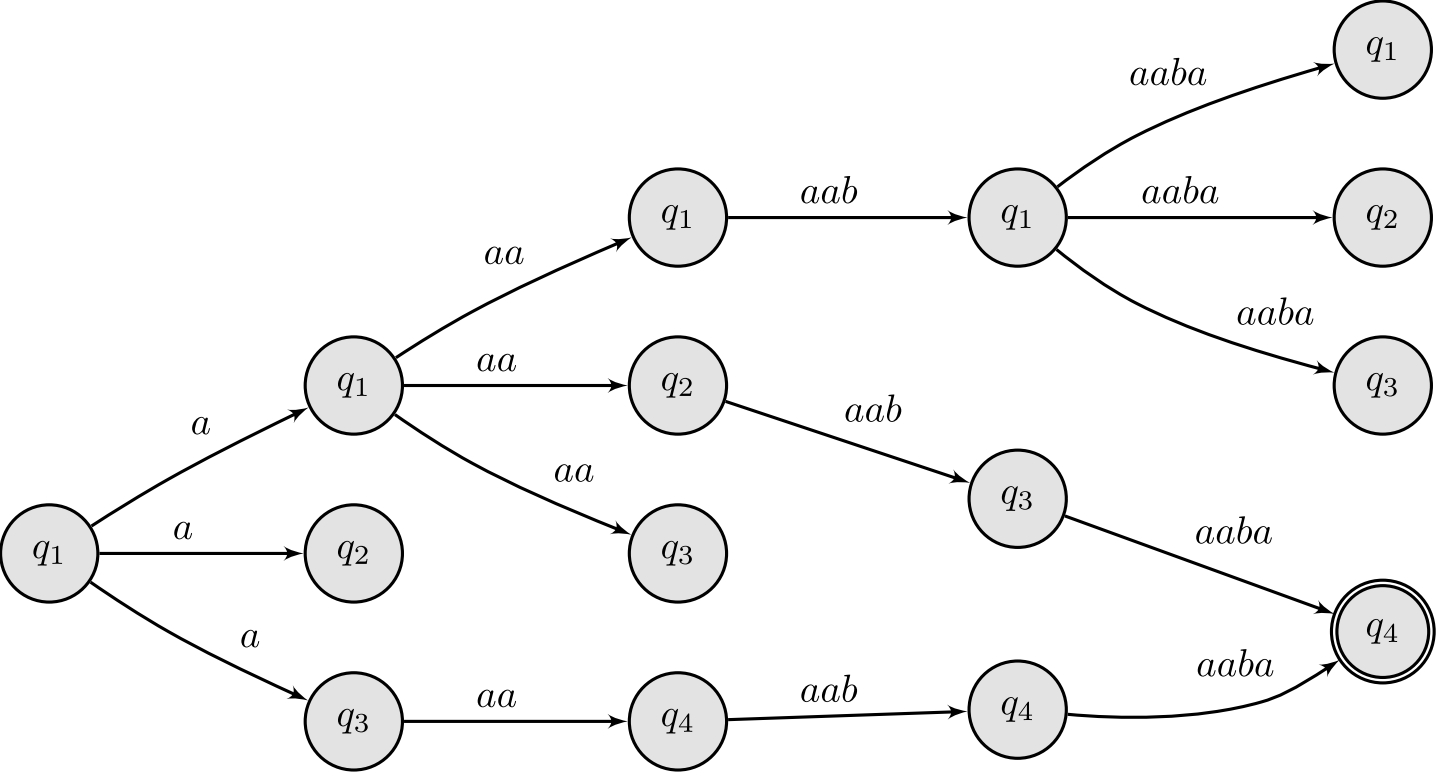
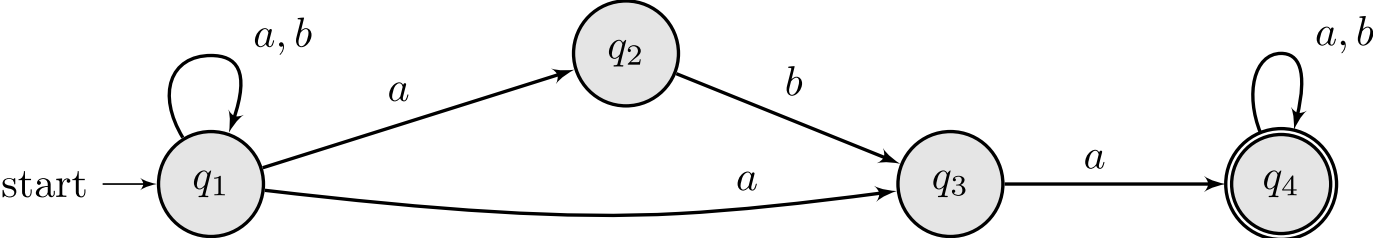
# Exercise 2: acceptance of **aa**a



# Exercise 2: acceptance of aab**a**



# Exercise 2: acceptance of aaba





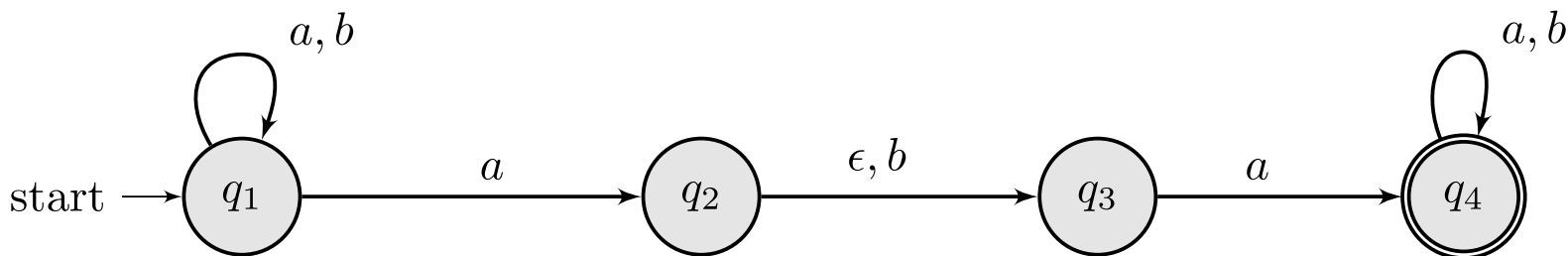
# Epsilon transitions

# Epsilon transitions

## Exercise 2

Let  $\Sigma = \{a, b\}$ . Give an NFA with four states that recognizes the following language

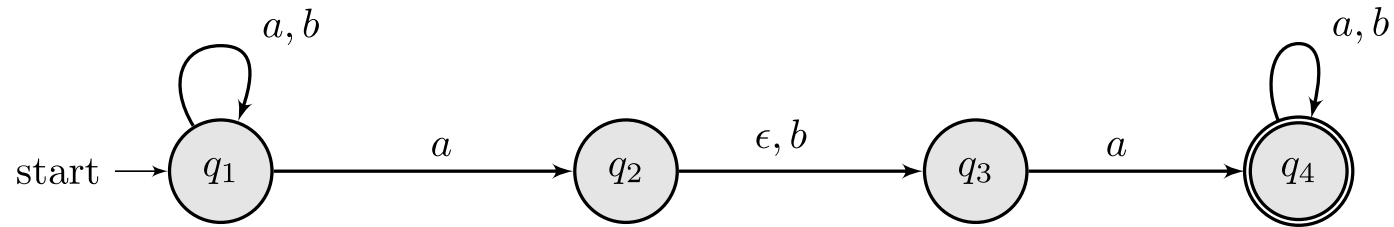
$$\{w \mid w \text{ contains the strings } aba \text{ or } aa\}$$



### Note

- NFAs can also include  $\epsilon$  transitions, which may be taken without consuming an input

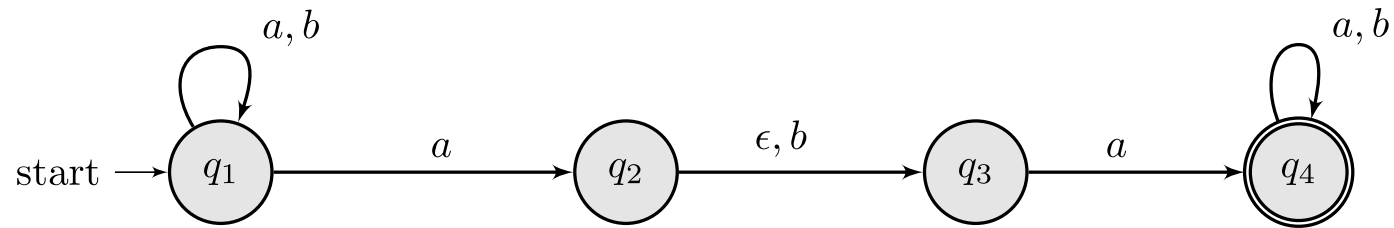
## Exercise 2: acceptance of **a**aba



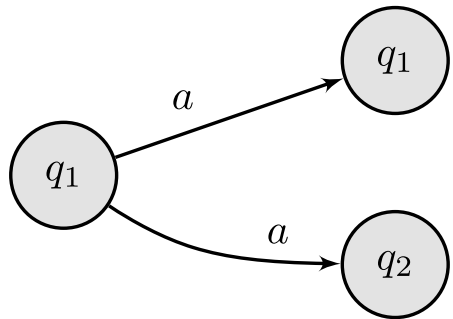
Interleave  
input with  $\epsilon$ .  
**Read a**



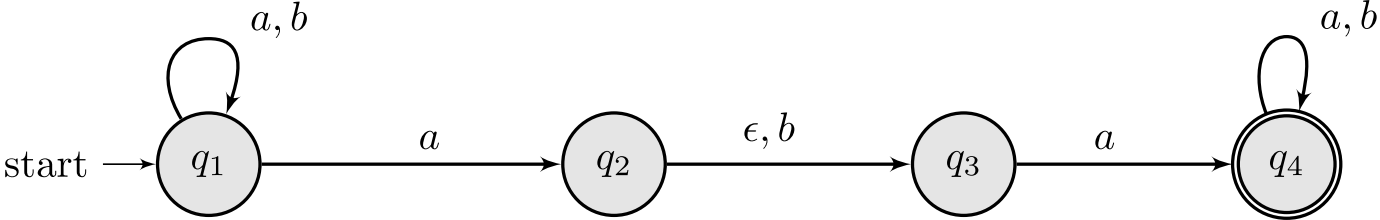
## Exercise 2: acceptance of $a\epsilon aba$



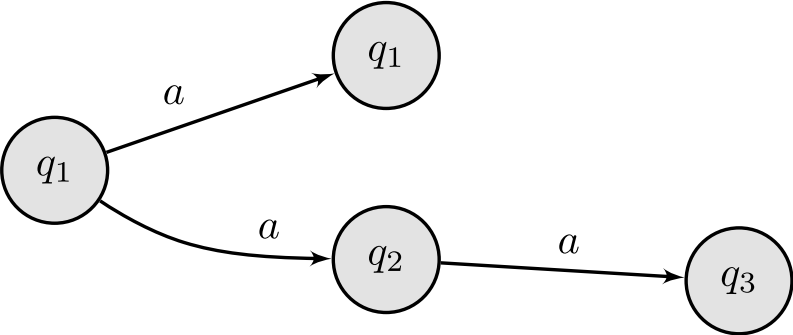
Interleave  
input with  $\epsilon$ .  
**Read  $\epsilon$**



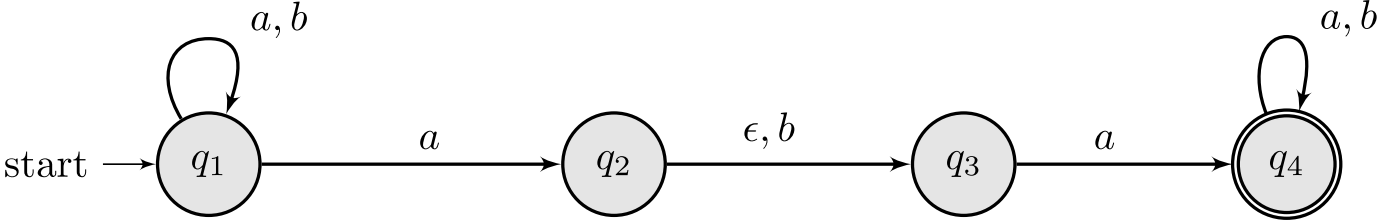
# Exercise 2: acceptance of **a**ba



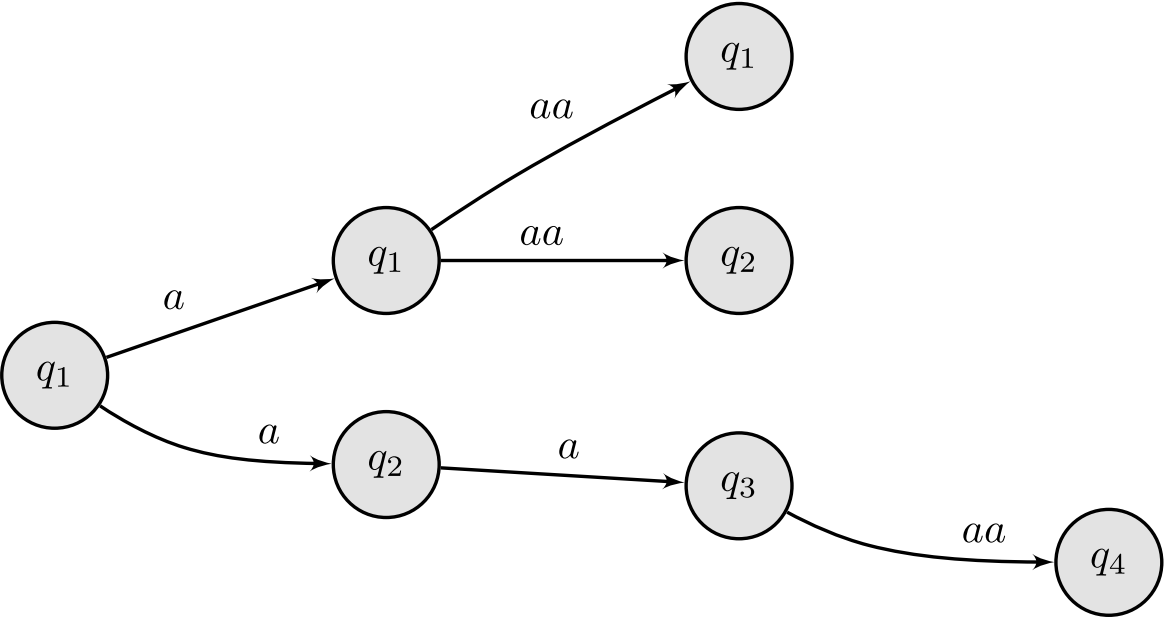
Interleave  
input with  $\epsilon$ .  
**Read a**



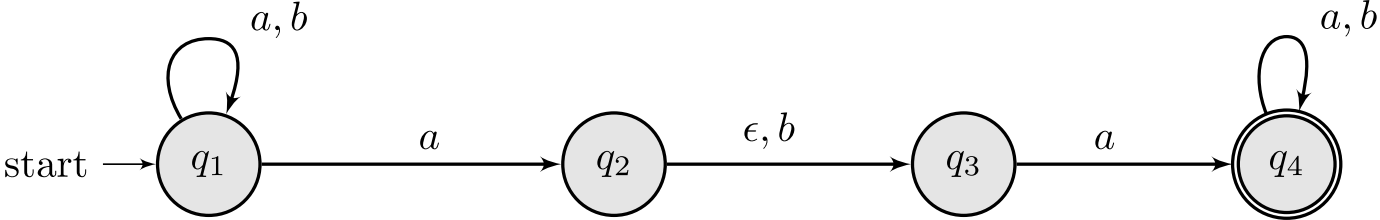
# Exercise 2: acceptance of aabεa



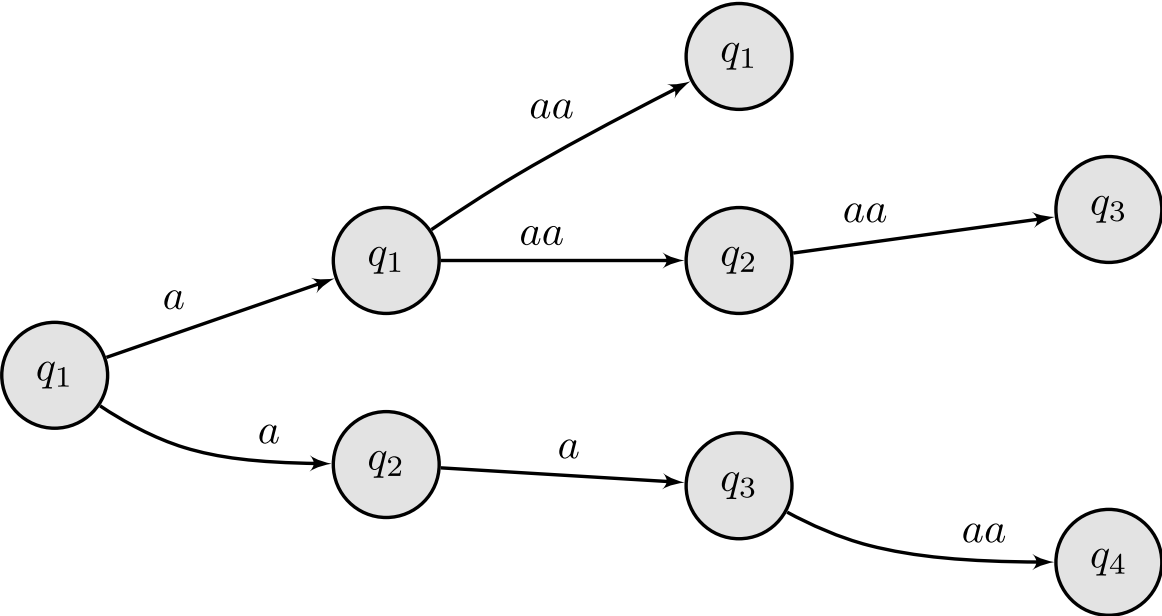
Interleave  
input with  $\epsilon$ .  
**Read  $\epsilon$**



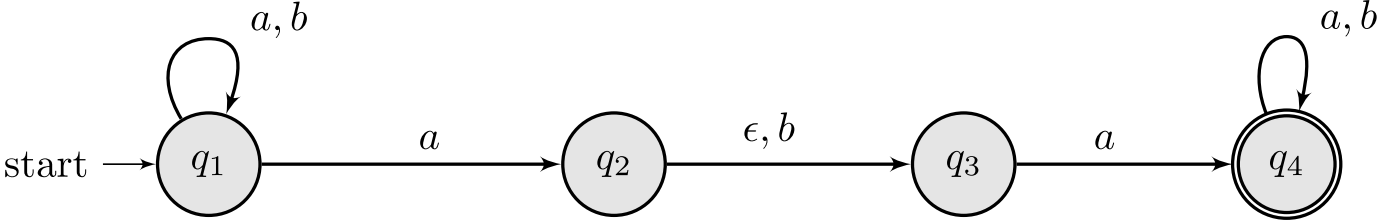
# Exercise 2: acceptance of **aa**a



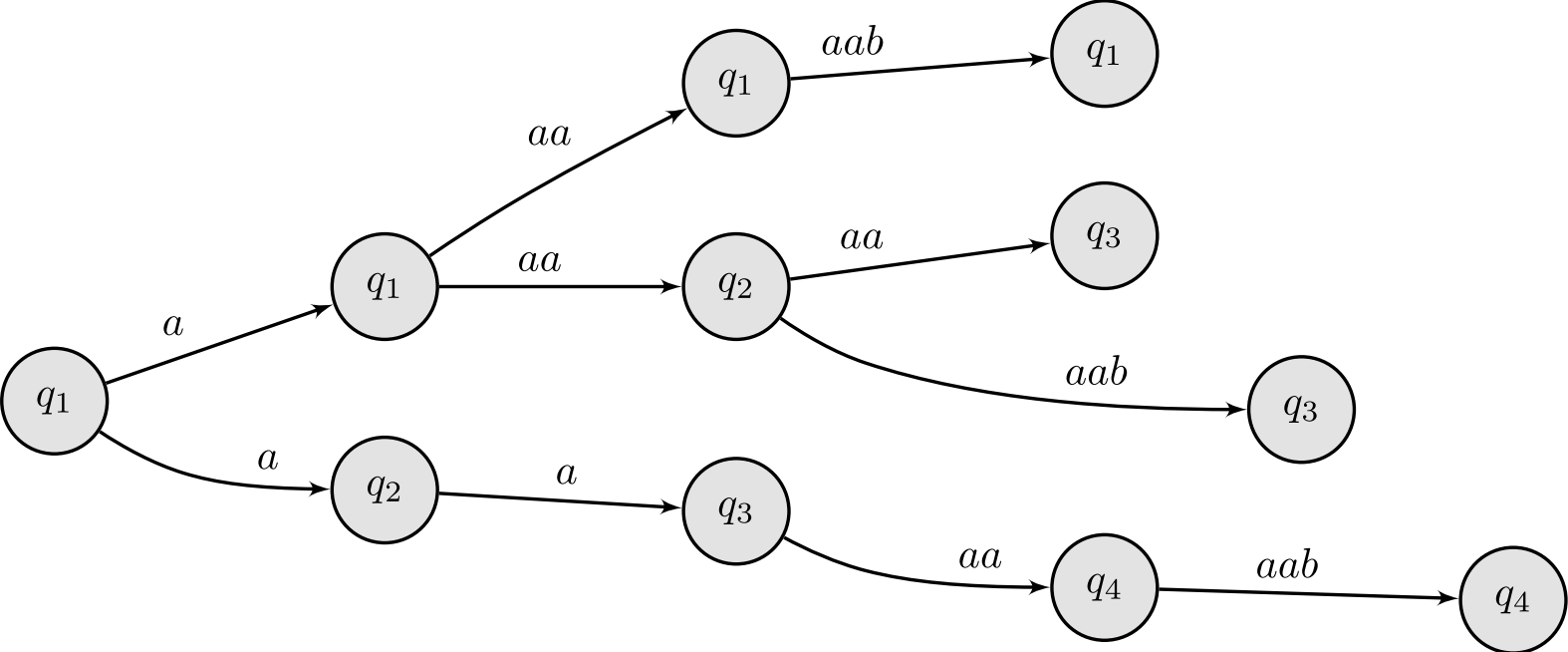
Interleave  
input with  $\epsilon$ .  
**Read b**



# Exercise 2: acceptance of aab**a**

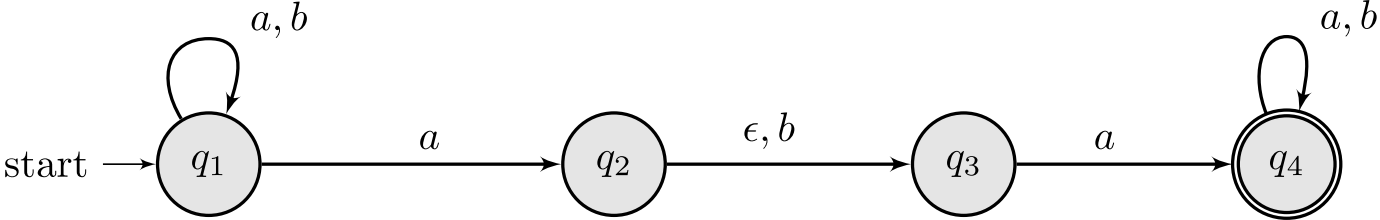


Interleave  
input with  $\epsilon$ .  
**Read a**

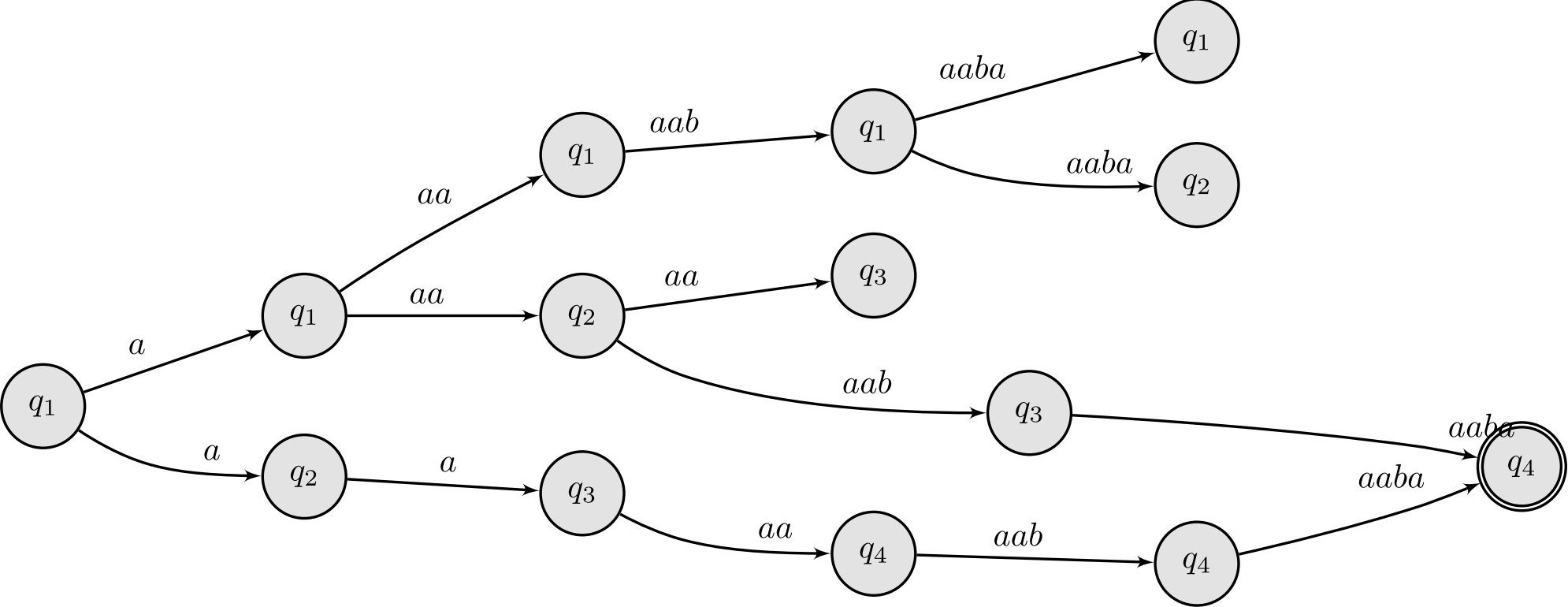




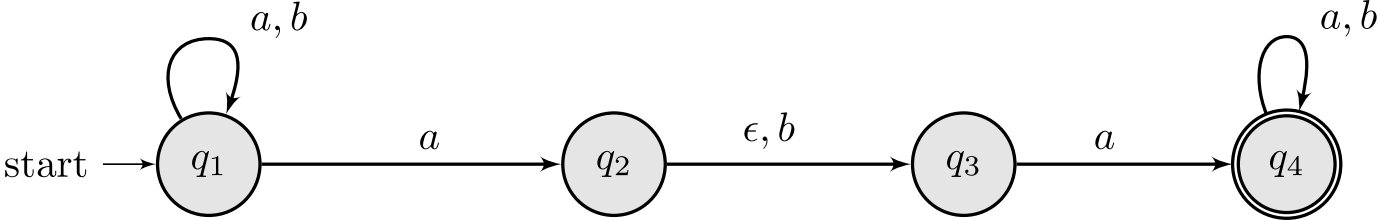
# Exercise 2: acceptance of $aaba\epsilon$



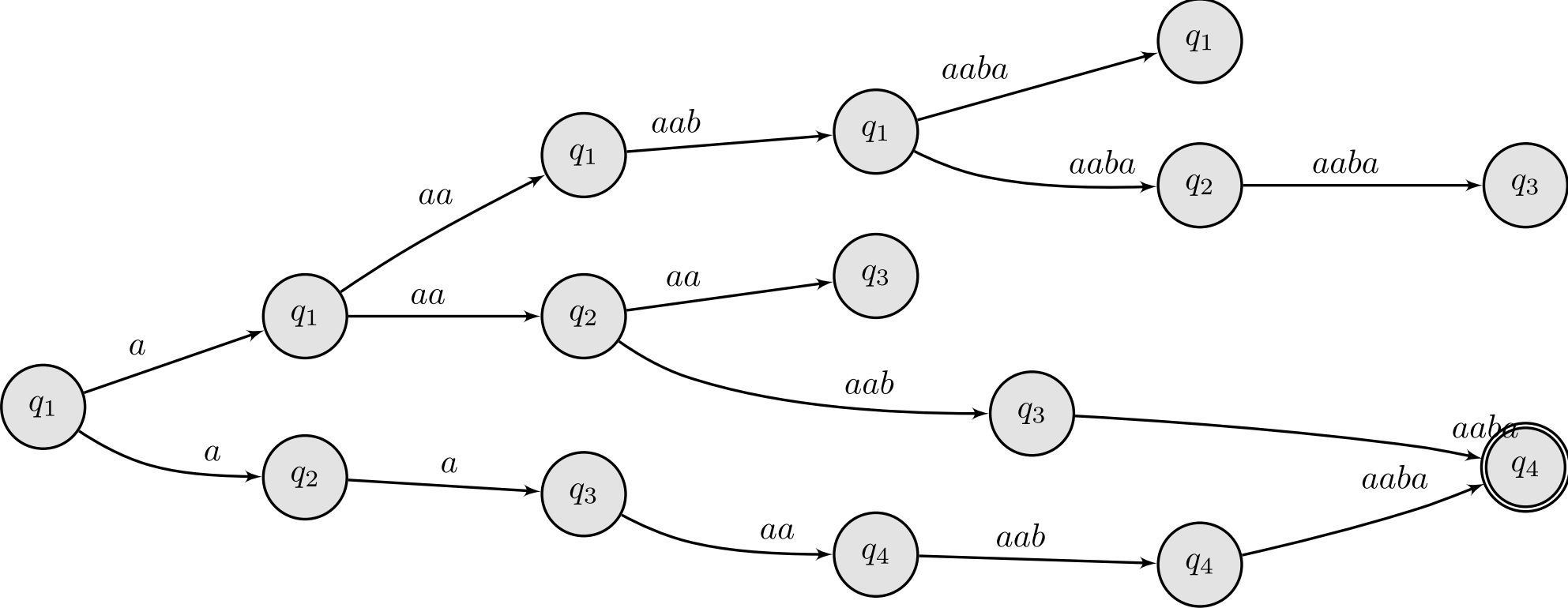
Interleave  
input with  $\epsilon$ .  
**Read  $\epsilon$**



# Exercise 2: acceptance of aaba



Interleave input with  $\epsilon$ .  
**Read  $\epsilon$**



# Formalizing NFA

# Formalizing an NFA

I am now going to

- introduce the **NFA** definition (as a tuple)
- introduce an  $\epsilon$ -NFA definition of **acceptance**
- introduce the DFA definition of **acceptance**

■ The two definitions of acceptance are equivalent.

# Formalizing an NFA

## Definition 1.37

A nondeterministic finite automaton is a 5-tuple  $(Q, \Sigma, \delta, q_0, F)$  where

1.  $Q$  is a finite set called **states**
2.  $\Sigma$  is a finite set called **alphabet**
3.  $\delta: Q \times \Sigma_\epsilon \rightarrow \mathcal{P}(Q)$  is the **transition function**
4.  $q_0 \in Q$  is the **start state**
5.  $F \subseteq Q$  is the set of **accepted states**

## Notes

- Function  $\delta$  is known as the power-set, it takes a type and yields a set of elements of that type. Intuitively, you can think of it as type  $\langle T \rangle$ , ie, a set of type  $T$ .
- Notation  $\Sigma_\epsilon$  is an abbreviation of  $\Sigma \cup \{\epsilon\}$

# Formalizing acceptance of an NFA

Let  $M = (Q, \Sigma, \delta, q_0, F)$ , let the **steps through** relation, notation  $q \xrightarrow{M} w$ , be defined as:

$$\frac{q \in F}{q \xrightarrow{M} \epsilon}$$

$$\frac{q' \in \delta(q, y) \quad q' \xrightarrow{M} w}{q \xrightarrow{M} y :: w}$$

$$\frac{q' \in \delta(q, \epsilon) \quad q' \xrightarrow{M} w}{q \xrightarrow{M} w}$$

**Rule 1.** State  $q$  steps through  $\epsilon$  if  $q$  is a final state.

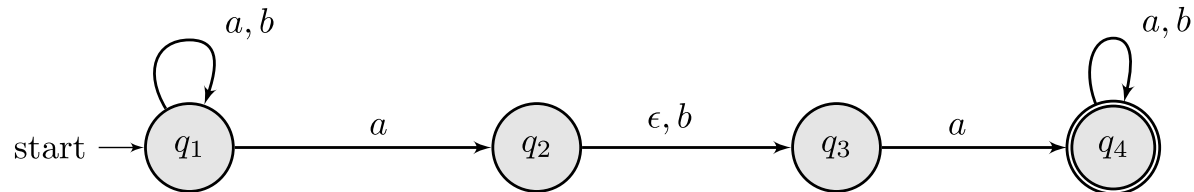
**Rule 2.** If we can go from  $q$  to  $q'$  with  $y$  and  $q'$  steps through  $w$ , then  $q$  steps through  $y :: w$ .

**Rule 3.** If we can go from  $q$  to  $q'$  with  $\epsilon$  and  $q'$  steps through  $w$ , then  $q$  also steps through  $w$ .

**Acceptance.** We say that  $M$  accepts  $w$  if, and only if,  $q_0 \xrightarrow{M} w$ .

# Example

Let  $M = (\{q_1, q_2, q_3, q_4\}, \{a, b\}, \delta, \{q_4\})$ .

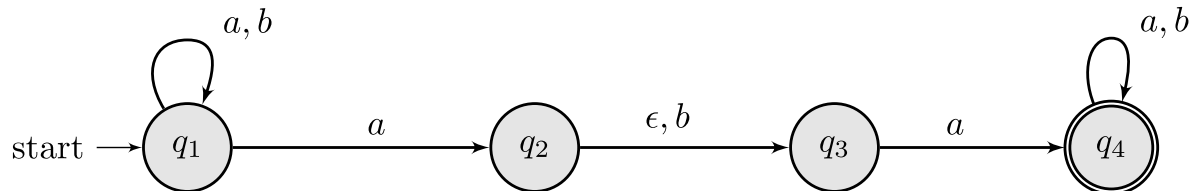


**Accept [b,a, a]? Proof:**

$\delta$	$\epsilon$	$\epsilon$	$\epsilon$
$q_1$	$\{q_1, q_2\}$	$\{q_1\}$	$\emptyset$
$q_2$	$\emptyset$	$\{q_3\}$	$\{q_3\}$
$q_3$	$\{q_4\}$	$\emptyset$	$\emptyset$
$q_4$	$\{q_4\}$	$\{q_4\}$	$\emptyset$

# Example

Let  $M = (\{q_1, q_2, q_3, q_4\}, \{a, b\}, \delta, \{q_4\})$ .



	$\delta$	$\epsilon$	
$q_1$	$\{q_1, q_2\}$	$\{q_1\}$	$\emptyset$
$q_2$	$\emptyset$	$\{q_3\}$	$\{q_3\}$
$q_3$	$\{q_4\}$	$\emptyset$	$\emptyset$
$q_4$	$\{q_4\}$	$\{q_4\}$	$\emptyset$

**Accept [b,a, a]? Proof:**

$$(R1) \frac{q \in F}{q \quad M \quad \square}$$

$$(R2) \frac{q' \in \delta(q, y) \quad q' \quad M \quad w}{q \quad M \quad y :: w}$$

$$(R3) \frac{q' \in \delta(q, \epsilon) \quad q' \quad M \quad w}{q \quad M \quad w}$$

$$\begin{array}{c}
 \frac{q_4 \in \delta(q_3, a) \quad \frac{q_4 \in \{q_4\}}{q_4 \quad M \quad \square}}{q_3 \quad M \quad [a]} \\
 \frac{q_2 \in \delta(q_1, a) \quad \frac{q_3 \in \delta(q_2, \epsilon) \quad \frac{q_4 \in \delta(q_3, a) \quad \frac{q_4 \in \{q_4\}}{q_4 \quad M \quad \square}}{q_3 \quad M \quad [a]}}{q_2 \quad M \quad [a, a]}}{q_1 \quad M \quad [a, a]} \\
 \frac{q_1 \in \delta(q_1, b) \quad \frac{q_2 \in \delta(q_1, a) \quad \frac{q_3 \in \delta(q_2, \epsilon) \quad \frac{q_4 \in \delta(q_3, a) \quad \frac{q_4 \in \{q_4\}}{q_4 \quad M \quad \square}}{q_3 \quad M \quad [a]}}{q_2 \quad M \quad [a, a]}}{q_1 \quad M \quad [a, a]}}{q_1 \quad M \quad [b, a, a]}
 \end{array}$$



# NFA Acceptance (book version)

We say that  $M$  accepts  $w$  if there exists a sequence of states  $r_0, \dots, r_m$  such that  $w =^* y_1, \dots, y_m, \forall y_i \in \Sigma_\epsilon, \forall r_i \in Q$ , and:

1.  $r_0 = q_0$
2.  $r_{i+1} \in \delta(r_i, y_{i+1})$  for  $i = 0, \dots, m - 1$
3.  $r_m \in F$

**\*Warning:** The book implicitly assumes equality up to removing  $\epsilon$ . For instance, the book's definition assumes that  $[b, a, \epsilon, a] = [b, a, a]$ ,

Example

According to the definition above  $M$  accepts  $[b, a, a]$  with the sequence of states

$$q_1 \xrightarrow{b} q_1 \xrightarrow{a} q_2 \xrightarrow{\epsilon} q_3 \xrightarrow{a} q_4 \quad \text{or just} \quad q_1 q_1 q_2 q_3 q_4$$

# Implementing an NFA

# Implementing an NFA

I am now going to

- implement an NFA as a Python class
- implement the acceptance algorithm
- show that we can translate a DFA into an NFA
- show that we can translate an NFA into a DFA

The implementation may serve as an intuition to understand the translation from an NFA into a DFA.

# Implementing an NFA

An NFA  $(Q, \Sigma, \delta, q_0, F)$  can be implemented with:

```
class NFA:
    def __init__(self, states, alphabet, transition_func, start_state, accepted_states):
        assert start_state in states, "%r in %r" % (start_state, states)
        self.states = states
        self.alphabet = alphabet
        self.transition_func = transition_func
        self.start_state = start_state
        self.accepted_states = accepted_states
```

# Nondeterministic acceptance

## Intuition

- **States:**

# Nondeterministic acceptance

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA  
For instance state  $\{q_1, q_2, q_3\}$  says that the acceptance algorithm is concurrently on these three states
- **Alphabet:**

# Nondeterministic acceptance

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA  
For instance state  $\{q_1, q_2, q_3\}$  says that the acceptance algorithm is concurrently on these three states
- **Alphabet:** same alphabet
- **Initial state:**

# Nondeterministic acceptance

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA  
For instance state  $\{q_1, q_2, q_3\}$  says that the acceptance algorithm is concurrently on these three states
- **Alphabet:** same alphabet
- **Initial state:** The start from an initial step and perform all possible  $\epsilon$  transitions.
- **Transition:**



# Nondeterministic acceptance

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA  
For instance state  $\{q_1, q_2, q_3\}$  says that the acceptance algorithm is concurrently on these three states
- **Alphabet:** same alphabet
- **Initial state:** The start from an initial step and perform all possible  $\epsilon$  transitions.
- **Transition:** Read one input on each "sub-state" (the input step) and then perform  $\epsilon$ -transitions (the epsilon-step)

# NFA Implementation

```

def accepts(self, inputs):

    states = self.epsilon({self.start_state})
    for i in inputs:
        if len(states) == 0:

            return False

        states = self.epsilon(self.transition(states, i))

    states = set(filter(self.accepted_states, states))
    return len(states) > 0
  
```

- **Input-step:** method transition performs a transition for every state (function  $\delta_U$ )
- **Epsilon-step:** method epsilon performs all possible  $\epsilon$ -transitions from a given set  $Q$  (function  $E$ )

# Nondeterministic transition $\delta_U$

$$\delta_U(R, a) = \bigcup_{q \in R} \delta(q, a)$$

```
def transition(self, states, input):
    new_states = set()
    for st in states:
        new_states.update(self.transition_func(st, input))
    return frozenset(new_states)
```

(See Theorem 1.39; in the book  $\delta_U$  is  $\delta'$ )

# Epsilon transition

$E(R) = \{q \mid q \text{ can be reached from } R \text{ by travelling along 0 or more } \epsilon \text{ arrows}\}$

```
def epsilon(self, states):  
    states = set(states)  
    while True:  
        count = len(states)  
        states.update(self.transition(states, None))  
        if count == len(states):  
            return states
```

(See Theorem 1.39)

Are all DFAs also NFAs?

# Are all DFAs also NFAs?

- **Yes**, DFAs can be trivially converted into NFAs.  
The state diagram of a DFA is equivalent to the same state diagram as an NFA.
- We only need to slightly change the transition function to handle  $\epsilon$  inputs.

# Are all DFAs also NFAs?

- **Yes**, DFAs can be trivially converted into NFAs.  
The state diagram of a DFA is equivalent to the same state diagram as an NFA.
- We only need to slightly change the transition function to handle  $\epsilon$  inputs.

## Implementation

```
def convert_to_nfa(dfa):
    return NFA(
        states=dfa.states,
        alphabet=dfa.alphabet,
        transition_func=lambda q, a: {dfa.transition_func(q, a),} if a is not None else {},
        start_state=dfa.start_state,
        accepted_states=dfa.accepted_states
    )
```

Are all NFAs also DFAs?



Are all NFAs also DFAs?

Yes!

# Theorem 1.39

## Every NFA has an equivalent DFA

- We study the algorithm that converts an NFA into a DFA  
This algorithm will be examined in Mini-Test 1.
- **Tip:** understanding the implementation of the acceptance algorithm, helps understanding the conversion and vice-versa

## Intuition

- **States:**

# Theorem 1.39

## Every NFA has an equivalent DFA

- We study the algorithm that converts an NFA into a DFA  
This algorithm will be examined in Mini-Test 1.
- **Tip:** understanding the implementation of the acceptance algorithm, helps understanding the conversion and vice-versa

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA
- **Alphabet:**

# Theorem 1.39

## Every NFA has an equivalent DFA

- We study the algorithm that converts an NFA into a DFA  
This algorithm will be examined in Mini-Test 1.
- **Tip:** understanding the implementation of the acceptance algorithm, helps understanding the conversion and vice-versa

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA
- **Alphabet:** same alphabet
- **Initial state:**

# Theorem 1.39

## Every NFA has an equivalent DFA

- We study the algorithm that converts an NFA into a DFA  
This algorithm will be examined in Mini-Test 1.
- **Tip:** understanding the implementation of the acceptance algorithm, helps understanding the conversion and vice-versa

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA
- **Alphabet:** same alphabet
- **Initial state:** The state that consists of an epsilon-step on the initial state.
- **Transition:**

# Theorem 1.39

## Every NFA has an equivalent DFA

- We study the algorithm that converts an NFA into a DFA  
This algorithm will be examined in Mini-Test 1.
- **Tip:** understanding the implementation of the acceptance algorithm, helps understanding the conversion and vice-versa

## Intuition

- **States:** Each state becomes a set of all possible concurrent states of the NFA
- **Alphabet:** same alphabet
- **Initial state:** The state that consists of an epsilon-step on the initial state.
- **Transition:** One input-step followed by one epsilon-step

# Are all NFAs also DFAs?

```

def nfa_to_dfa(nfa):
    def transition(q, c):
        return nfa.epsilon(nfa.transition(q, c))

    def accept_state(qs):
        for q in qs:
            if nfa.accepted_states(q):
                return True
        return False

    return DFA(
        powerset(nfa.states),
        nfa.alphabet,
        transition,
        nfa.epsilon({nfa.start_state}),
        accept_state)
  
```

# Theorem 1.39

## Every NFA has an equivalent DFA

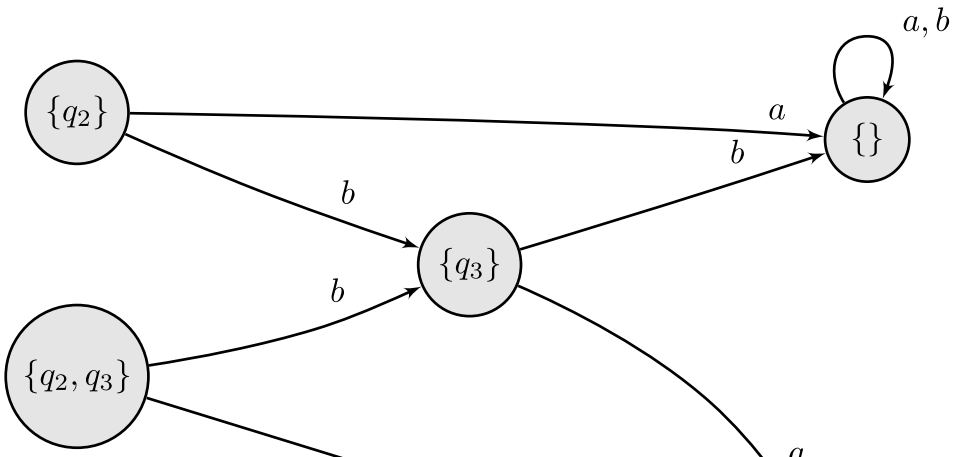
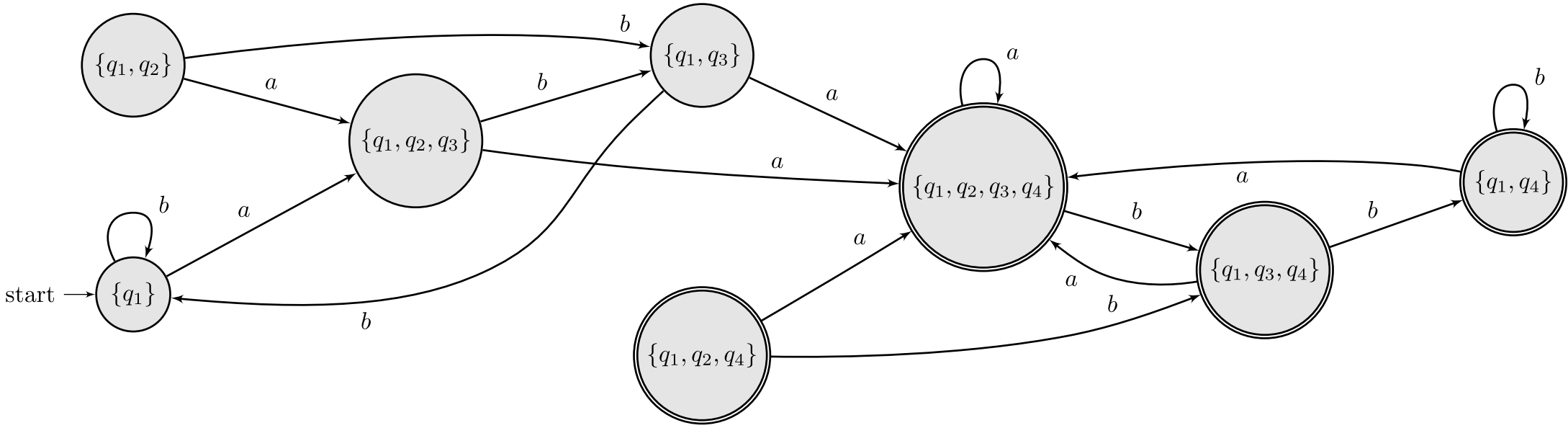
Formally, we introduce function `nfa2dfa` that converts an NFA into a DFA.

$\text{nfa2dfa}((Q, \Gamma, \delta, q_1, F)) = ((Q), \Gamma, \delta_D, E(q_1), F_D)$  where

- $\delta_D(Q, c) = E(\delta_U(Q, c))$
- $F_D = \{Q \mid Q \cap F \neq \emptyset\}$



# Producing a DFA from an NFA



# Producing a DFA from an NFA

- The algorithm we implemented yields **unreachable** states
- We can eliminate such states with a standard graph operation: we obtain the strongly connected component of the initial state: the subgraph that consists of every reachable state from the initial state.

# Example

