

Model Checking

what is it? And what is it good for?

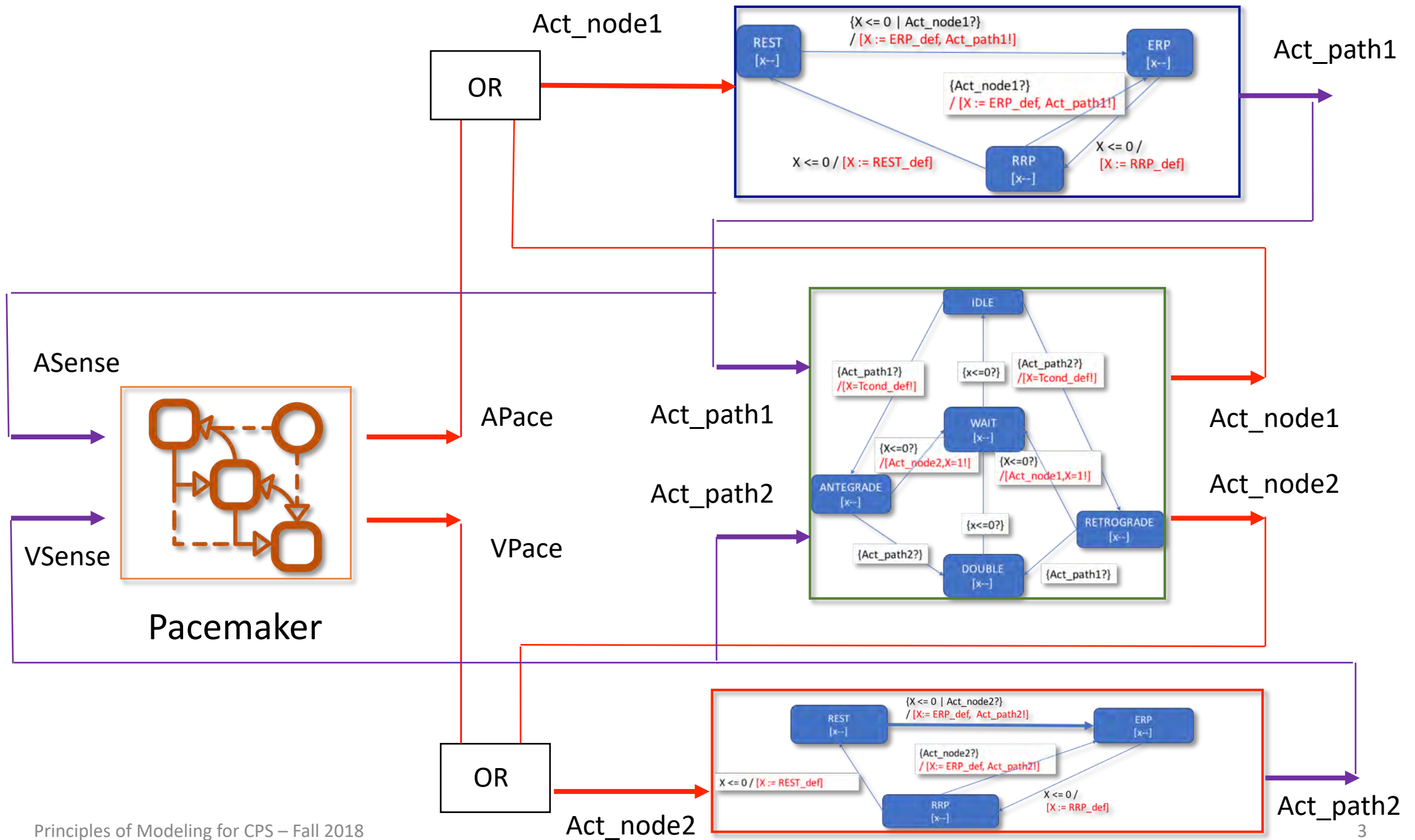
Lecture 14

Principles of Modeling for Cyber-Physical Systems

Instructor: Madhur Behl

So far..

- We modeled the heart (and pacemaker) as a timed automaton with clocks, resets and actions (messages) = timed automaton



So far..

- We modeled the heart (and pacemaker) as a timed automaton with clocks, resets and actions (messages) = timed automaton
- The modeling effort allows us to better understand the heart, ask the right questions, and focus on the important aspects for the task at hand.
- Importantly, it allows us to *automatically and exhaustively check* whether the heart+pacemaker satisfies some desirable properties.

Automatically and exhaustively

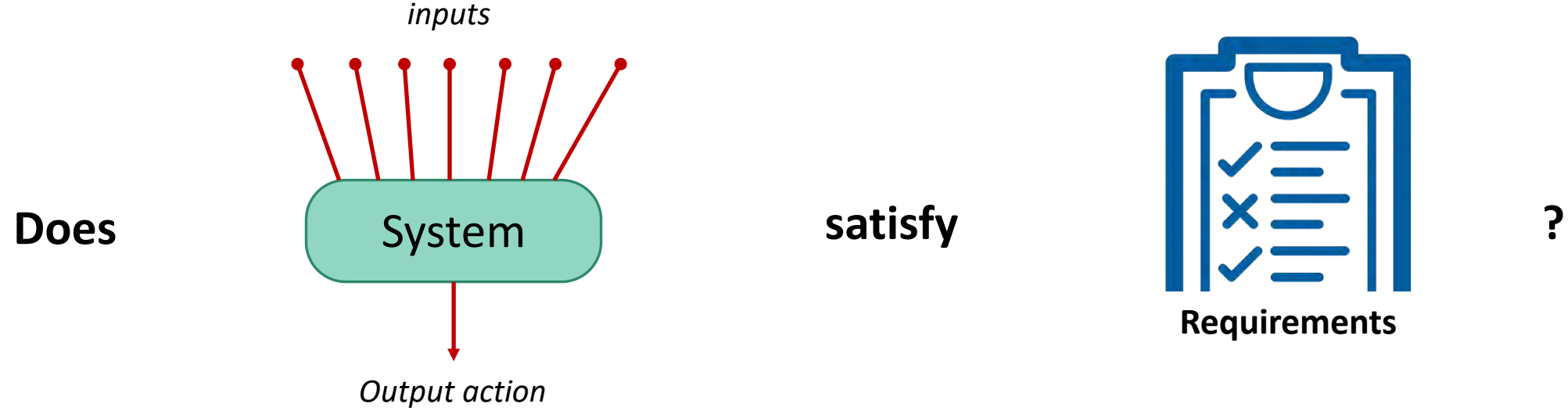
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Automatically and exhaustively

- Importantly, it allows us to *automatically and exhaustively check* whether the heart+pacemaker satisfies some desirable properties.
- Automatically: through a computer program
 - You provide a proof of a mathematical theorem...
 - ...vs. the computer provides the proof
- Exhaustively:
 - Testing: simulate the system N times. If testing returns “No bug found”, there could still be a bug (e.g., revealed if you do another N simulations)
 - Exhaustive verification: if the model checker returns “Model is correct”, then this answer is definitive – there is indeed no specification violation. All executions of the model have been *exhaustively* checked.

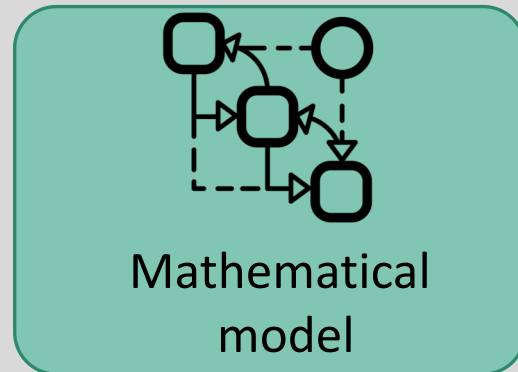
Next few lectures..

- We explore the basic ideas behind *model checking*: an automatic and exhaustive way of checking whether a **system model** satisfies some **desirable property**.
- Our timed automata are more complex than the models we study in this lecture - but what we study forms the basis for understanding all model checking algorithms out there.



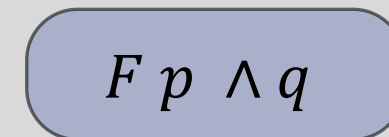
Model Checking UPPAAL Model Checker

Does



Transition Systems

satisfy



Formal notation

Linear Temporal Logic

?

Model Checking

- See Itlmc.ppt

(LTL) Model Checking

Flavio Lerda

with edits by Madhur Behl

Model checking: ingredients

- A *mathematical model* of the system to be verified
- A specification of correct behavior
- Seek to answer: does *every* infinite behavior of the system satisfy the specification?

Ingredients: Heart + pacemaker

- *A mathematical model* of the system:
timed automata model of composition of heart + pacemaker
- A specification of correct behavior: e.g.,
Always, an Asense is followed by another Asense in at most 500ms
- Seek to answer: does *every* infinite behavior of the system satisfy the specification?

Model checking: the question

- Can we answer the question *definitively*?
I.e. if the answer is Yes, this is a guarantee that the system model will never produce incorrect behavior.
- Contrast with testing

This lecture

- LTL model checking:
 - The model is a transition system
 - The correct behavior is an LTL formula
- Objective: understand fundamental concepts and uses of model checking

Atomic propositions

- A system model has variables, e.g., voltage.
- An *atomic proposition* p is a statement about the state variable, e.g. $p := \text{“voltage} > 5\text{”}$ or $\text{“-4} \leq \text{voltage} \leq 4\text{”}$.
- In what follows, AP will denote a set of atomic propositions.

System model: a transition system

- A **Transition System (TS)** is a tuple $\langle S, I, A, \delta, AP, L \rangle$
 - S is a finite set of **states**
 - $I \subseteq S$ is a set of **initial states**
 - A is a finite set of **inputs (or `actions')**
 - $\delta \subseteq S \times A \times S$ is a **transition relation**: $s \rightarrow_a s'$
 - AP is a set of atomic propositions on S
 - $L: S \rightarrow 2^{AP}$ is a *state labeling function*.
Intuitively, $L(s)$ is the set of atomic propositions satisfied by state s .

$S: \{s_0, s_1, s_2\}$

$I: \{s_0\}$

$A: \{a, b, c\}$

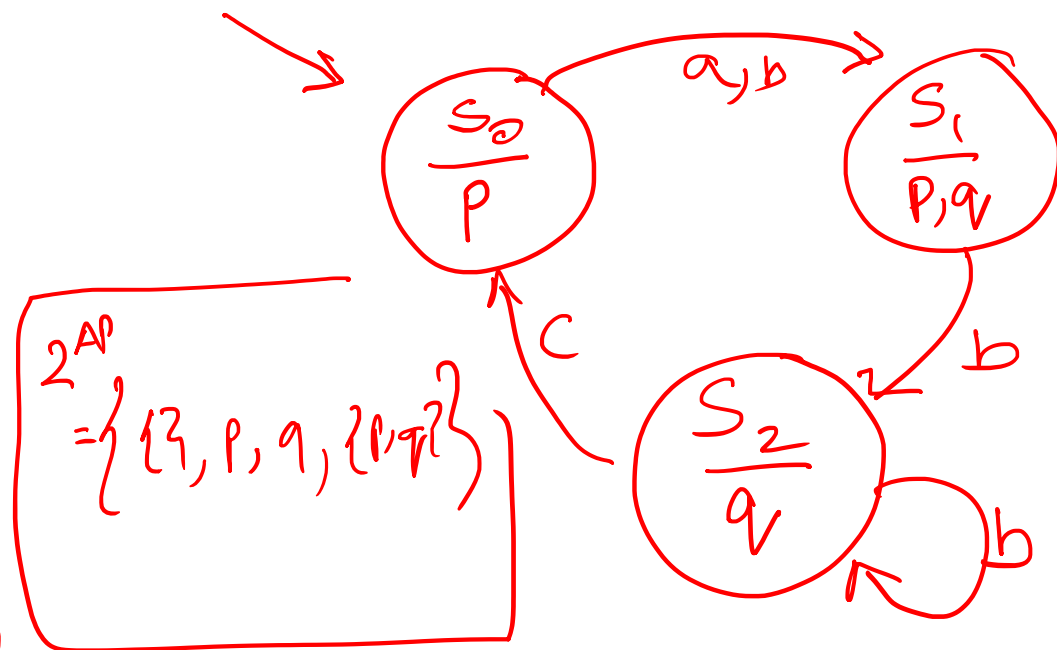
$\delta: \{ \langle s_0, a, s_1 \rangle, \langle s_1, b, s_2 \rangle, \langle s_2, c, s_0 \rangle, \langle s_2, b, s_2 \rangle \}$

$AP: \{p, q\}$

$L: S \rightarrow 2^{AP}$

$L(s_0) = p, L(s_1) = \{p, q\}, L(s_2) = q$

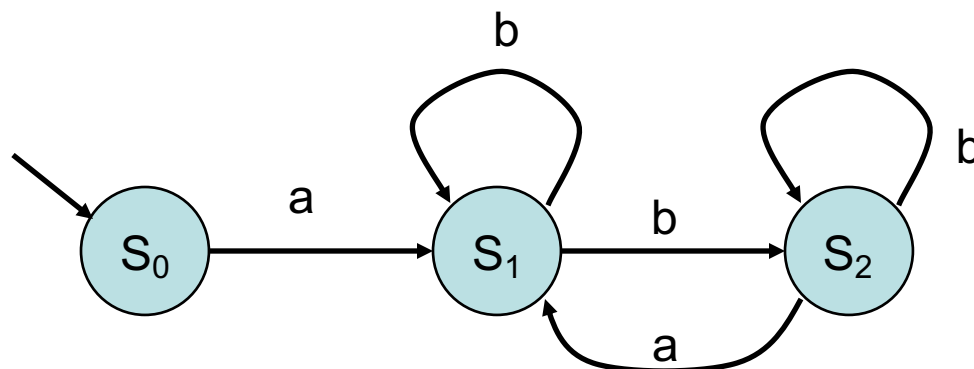
$T = \langle S, I, A, \delta, AP, L \rangle$



$\Omega = \{x_1, \dots, x_k\}$

$2^\Omega = \{ \{ \}, \{x_1\}, \dots, \{x_k\}, \{x_1, x_2\}, \dots, \{x_{k-1}, x_k\}, \{x_1, \dots, x_k\} \}$

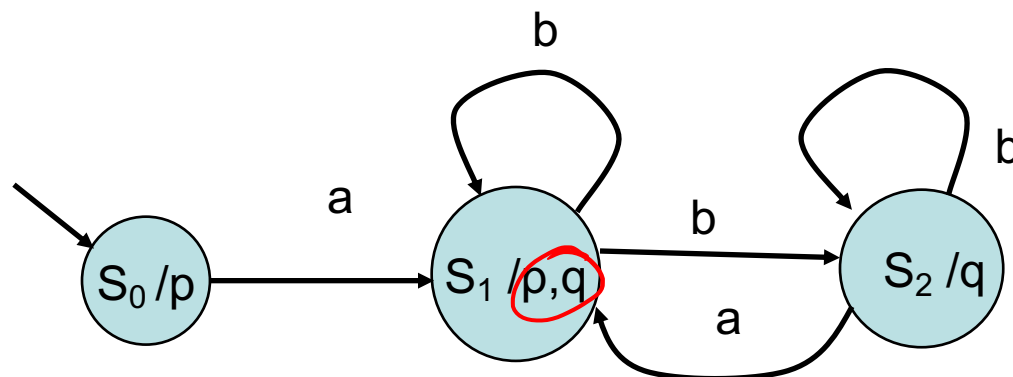
Example transition system



Identify the elements $\langle S, I, A, \delta, AP, L \rangle$ of this transition system

$\delta \{ \langle S_0, a, S_1 \rangle \langle S_2, b, S_2 \rangle$
 $\langle S_1, b, S_1 \rangle \langle S_2, a, S_1 \rangle \}$
 $\langle S_1, a, S_2 \rangle$

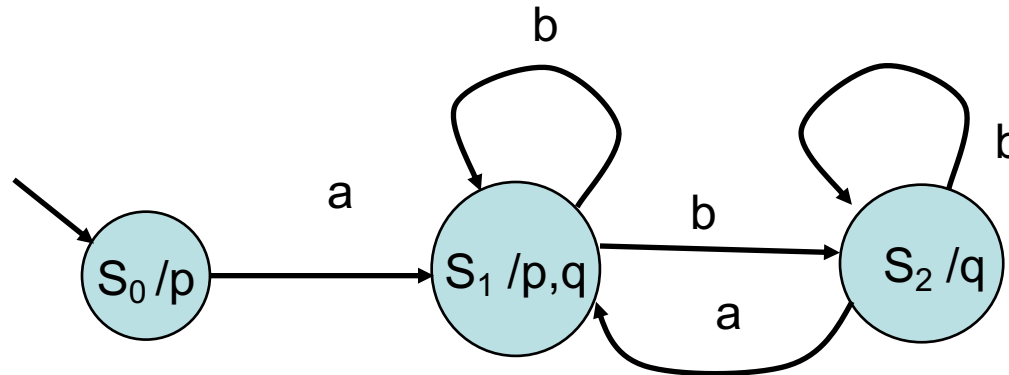
Example transition system



Labeling function: $L(s_0) = p$, $L(s_1) = \{p, q\}$, $L(s_2) = q$

$AP = \{p, q\}$ $L: S \rightarrow 2^{AP}$

Example transition system



A *path* is an (infinite) sequence of states in the TS.

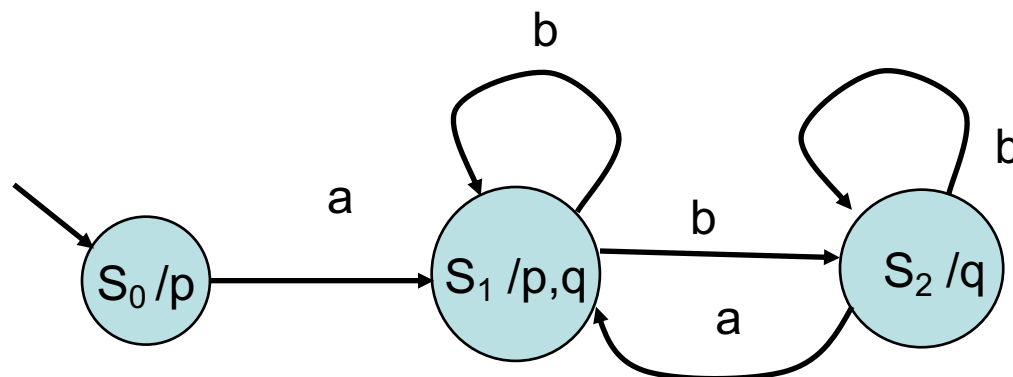
E.g. $\sigma = S_0 S_1 S_2 S_2 S_2 S_2 \dots$ is a path in this TS

A *trace* is the corresponding sequence of labels.

E.g. $p\{p,q\}qqqq\dots$ is the trace corresponding to σ

A *word* is a sequence of inputs, e.g. $abbbbbbb\dots$ induces σ

Example transition system



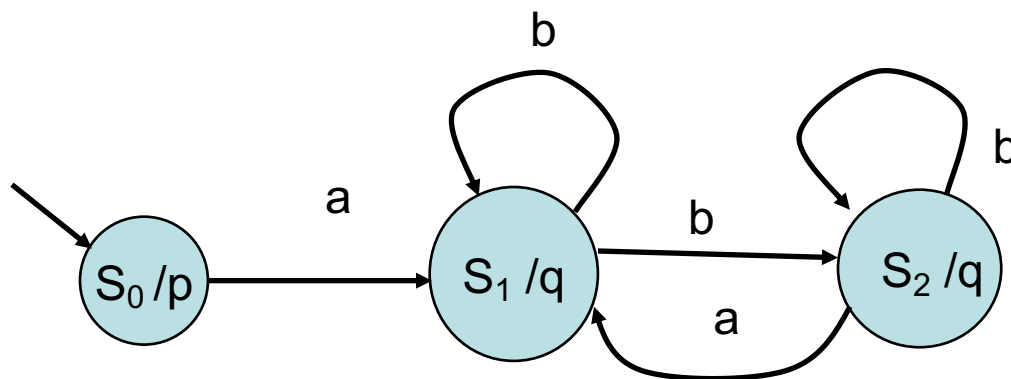
Word abbbbbb... gives path $\sigma_1 = S_0 S_1 S_2 S_2 S_2 S_2 \dots$ with trace $p\{p,q\}q^+$

Word abbbbbb... gives path $\sigma_2 = S_0 S_1 S_1 S_1 S_1 S_1 \dots$ with trace $p\{p,q\}^+$

Word ababab... gives path $\sigma_3 = S_0 S_1 S_2 S_1 S_2 S_1 \dots$ with trace $p(\{p,q\}q)^*$

Word ababbb... gives path $\sigma_4 = S_0 S_1 S_2 S_1^*$ with trace $p\{p,q\}p\{p,q\}^*$

Example transition system



Word abbbbb... gives path $\sigma_1 = S_0 S_1 S_2 S_2 S_2 S_2 \dots$ with trace pqqq...

Word abbbbb... gives path $\sigma_2 = S_0 S_1 S_1 S_1 S_1 S_1 \dots$ with trace pqqq...

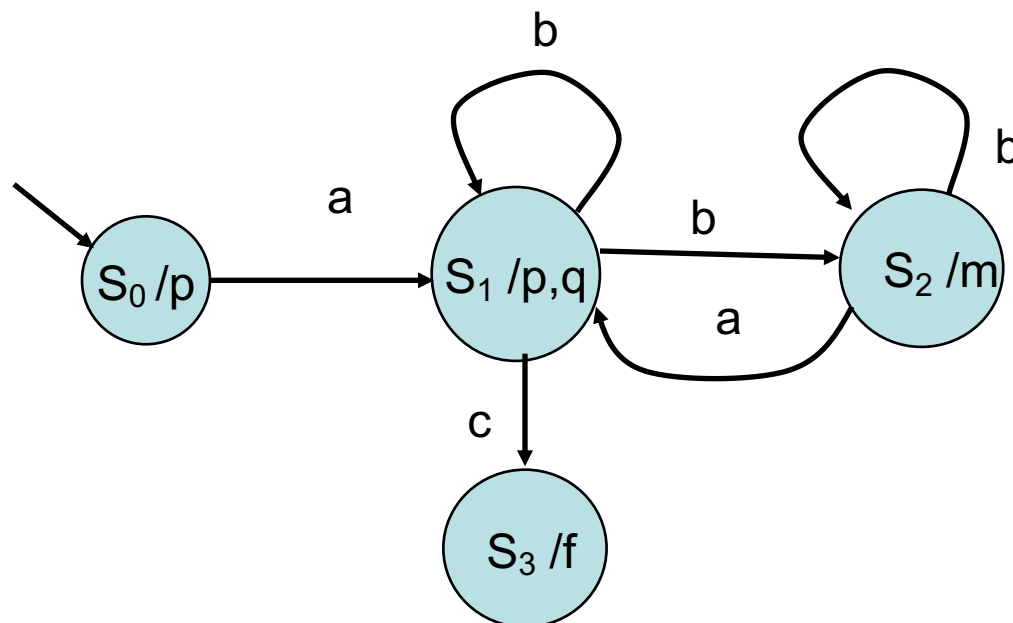
Word ababab... gives path $\sigma_3 = S_0 S_1 S_2 S_1 S_2 S_1 \dots$ with trace pqqq...

Word ababbb... gives path $\sigma_4 = S_0 S_1 S_2 S_1 \dots$ with trace pqqq...

Model checking

- *A mathematical model* of the system to be verified
- **A specification of correct behavior**
- Seek to answer: does *every* infinite behavior of the system satisfy the specification?

Example specifications



m holds true eventually

m is always followed by q

p holds continuously before f holds

$p \wedge (p, q) m^+ \rightarrow x$

$p \wedge (p, q) (m) p, q \downarrow$

Logic

- Rather than focus on specific properties, like those described earlier, and developing custom property-specific checking algorithms...
- Let's define a language for describing *all* (most) properties of interest for systems modeled as transition systems...
- ...then develop an algorithm for checking *any property expressible in this language*.

Linear Temporal Logic (LTL)

- LTL is a logic (a ‘language’) for describing properties of transition systems
- p_k = an *atomic proposition*
- For example, if x is a voltage signal
 - $p_1 := x < 70\text{mV}$
 - $p_2 := t > 500\text{ms}$
 - $p_3 := \ln(x) > -0.5$
 - $p_4 := e^{ax} + \cos(x) > 45$

b

Linear Temporal Logic (LTL)

- LTL is **boolean** logic, augmented with **two temporal operators**: X (next) and U (until)
- An LTL formula is defined inductively as follows:
 - Every atomic proposition p is a formula
 - If φ_1 and φ_2 are LTL formulas, then $\sim\varphi_1$, $\varphi_1 \vee \varphi_2$, $\varphi_1 \wedge \varphi_2$ are also LTL formulas
 - $X \varphi_1$ is a formula
 - $\varphi_1 U \varphi_2$ is a formula

Boolean Operators

NOT

P	\neg
<i>True</i>	
<i>False</i>	

Boolean Operators

NOT

P	\neg
<i>True</i>	<i>False</i>
<i>False</i>	<i>True</i>

Boolean Operators

AND

P	Q	$P \wedge Q$
<i>True</i>	<i>True</i>	
<i>True</i>	<i>False</i>	
<i>False</i>	<i>True</i>	
<i>False</i>	<i>False</i>	

Boolean Operators

AND

P	Q	$P \wedge Q$
<i>True</i>	<i>True</i>	<i>True</i>
<i>True</i>	<i>False</i>	<i>False</i>
<i>False</i>	<i>True</i>	<i>False</i>
<i>False</i>	<i>False</i>	<i>False</i>

Boolean Operators

OR

P	Q	$P \vee Q$
<i>True</i>	<i>True</i>	
<i>True</i>	<i>False</i>	
<i>False</i>	<i>True</i>	
<i>False</i>	<i>False</i>	

Boolean Operators

OR

P	Q	$P \vee Q$
<i>True</i>	<i>True</i>	<i>True</i>
<i>True</i>	<i>False</i>	<i>True</i>
<i>False</i>	<i>True</i>	<i>True</i>
<i>False</i>	<i>False</i>	<i>False</i>

Boolean Operators

IMPLIES

P	Q	$P \rightarrow Q$
<i>True</i>	<i>True</i>	
<i>True</i>	<i>False</i>	
<i>False</i>	<i>True</i>	
<i>False</i>	<i>False</i>	

Boolean Operators

IMPLIES

P	Q	$P \rightarrow Q$
<i>True</i>	<i>True</i>	<i>True</i>
<i>True</i>	<i>False</i>	<i>False</i>
<i>False</i>	<i>True</i>	<i>True</i>
<i>False</i>	<i>False</i>	<i>True</i>

So $p \rightarrow q$ follows the following reasoning:

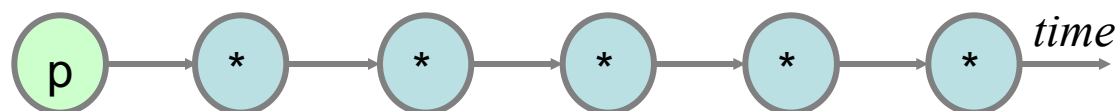
- 1.a True premise implies a True conclusion, therefore $T \rightarrow T$ is T;
- 2.a True premise cannot imply a False conclusion, therefore $T \rightarrow F$ is F; and
- 3.you can conclude anything from a false assumption, so $F \rightarrow \text{anything}$ is T.

Linear Temporal Logic (LTL)

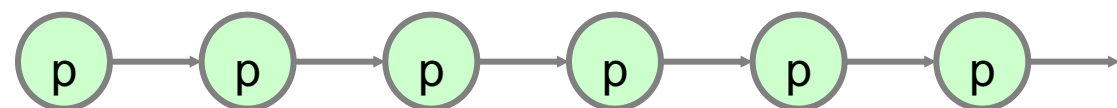
- LTL is **boolean** logic, augmented with **two temporal operators**: X (next) and U (until)
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 - Every atomic proposition p is a formula
 - If φ_1 and φ_2 are LTL formulas, then $\sim\varphi_1$,
 - $\varphi_1 \vee \varphi_2$, $\varphi_1 \wedge \varphi_2$ are also LTL formulas
 - $X \varphi_1$ is a formula
 - $\varphi_1 U \varphi_2$ is a formula

LTL semantics intuition (slide courtesy of G. Fainekos at ASU)

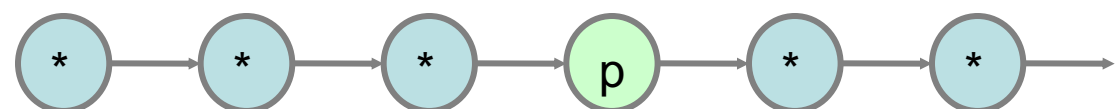
p – p now



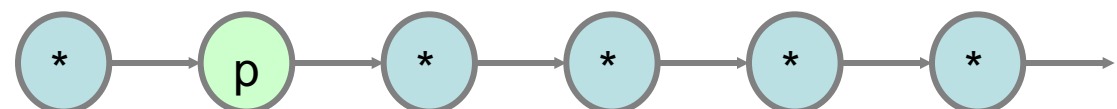
$G p$ – always p



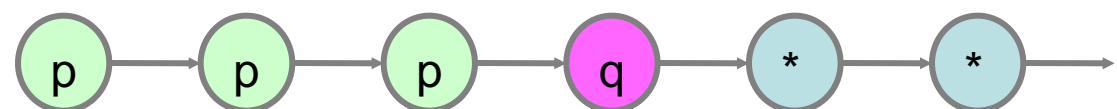
$F p$ – eventually p



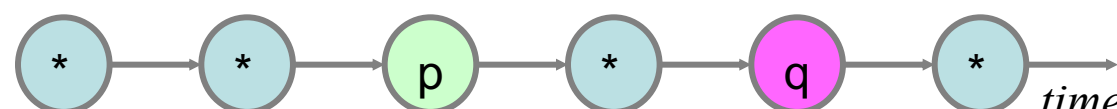
$X p$ – next state p

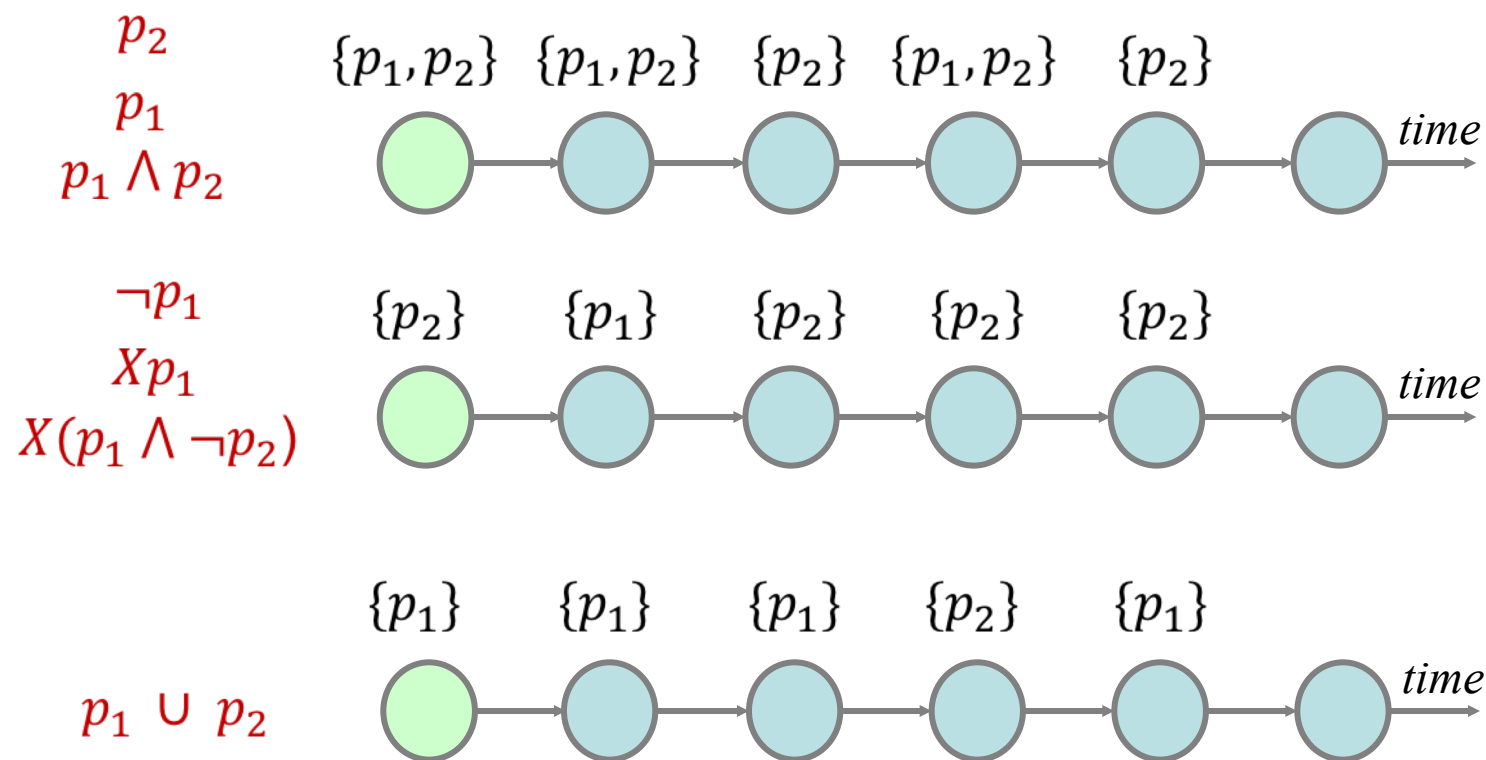


$p \mathcal{U} q$ – p until q



$p \mathcal{B} q$ – p before q



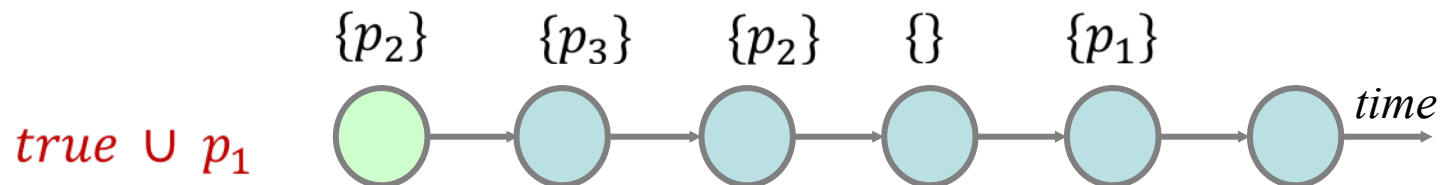
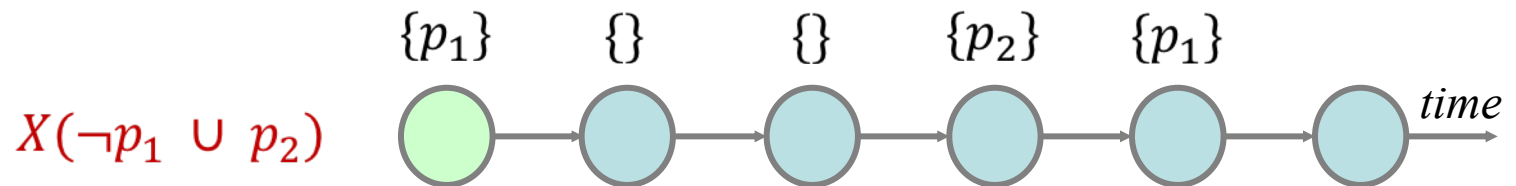
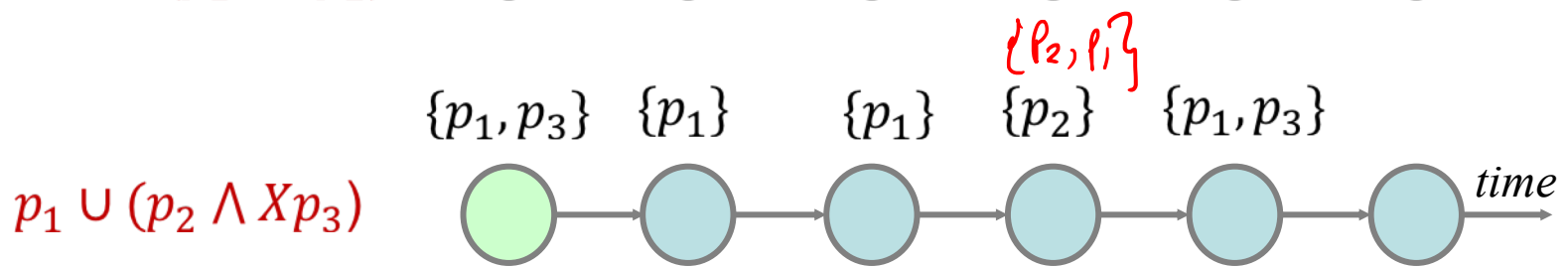
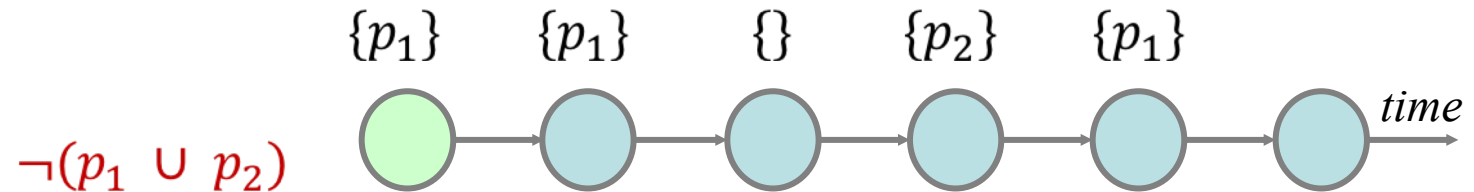


$\phi ::= true \mid p_1 \mid \phi_1 \wedge \phi_2 \mid \neg \phi_1 \mid X\phi \mid \phi_1 \cup \phi_2$

$p_i \in AP$

$\phi_1, \phi_2: LTL \text{ formulas}$

$$\phi := true \mid p_1 \mid \emptyset_1 \wedge \emptyset_2 \mid \neg \emptyset_1 \mid X\emptyset \mid \emptyset_1 \cup \emptyset_2$$



F p_1

$G p_1$

Globally

$p_1 \cup \text{false} \xrightarrow{x}$

$p_1 \cup (\neg \text{true})$

$\neg(F \neg p_1)$

$\neg(\text{true} \cup \neg p_1)$

$\neg \text{true} \cup p_1 \Rightarrow \text{false} \cup p_1 \quad x$

$\neg(\text{true} \cup p_1) \rightarrow \neg \text{true} \rightarrow \text{false} \quad x$

$(p_1 \cup \text{true}) \rightarrow p_1, p_1, \text{true} \quad x$

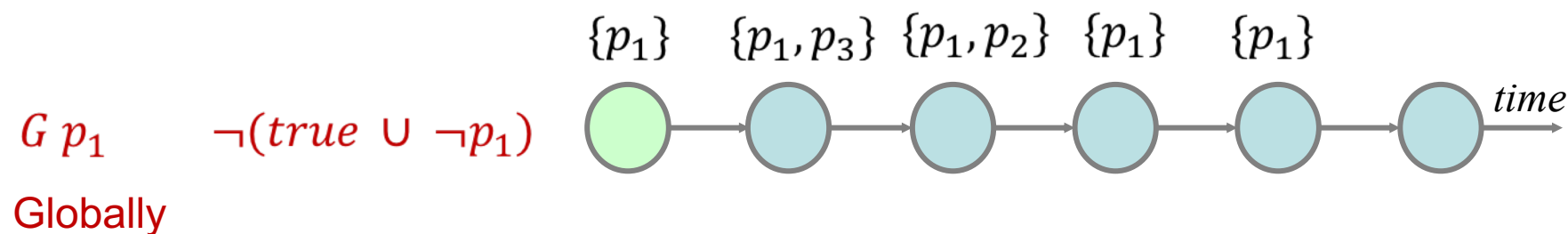
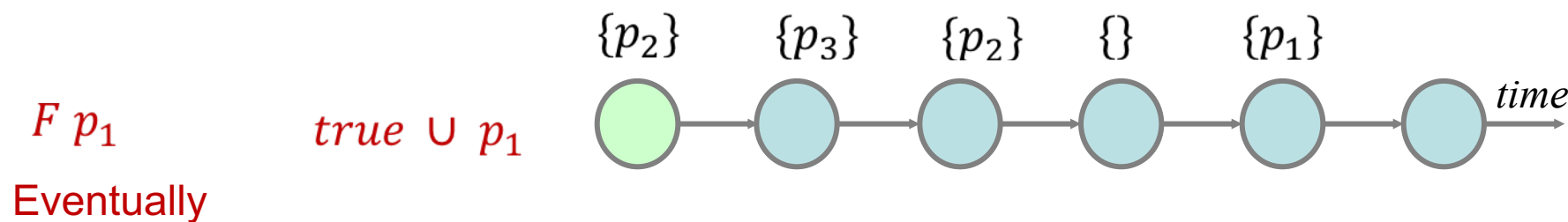
$p_1 \cup p_1 \rightarrow p_1$

$p_1 \wedge \neg p_1 \rightarrow p_1, \text{false}$

$p_1 \wedge Gx$

$p_1 \wedge \text{true} \rightarrow$

Derived formulae



Linear Temporal Logic (LTL)

- LTL is **boolean** logic, augmented with **two temporal operators**: X (next) and U (until)
- An LTL formula is defined inductively as follows:
 - Every atomic proposition p is a formula
 - If φ_1 and φ_2 are LTL formulas, then $\sim\varphi_1$,
 - $\varphi_1 \vee \varphi_2$, $\varphi_1 \wedge \varphi_2$ are also LTL formulas
 - $X \varphi_1$ is a formula
 - $\varphi_1 U \varphi_2$ is a formula

Notation

- Sometimes you'll see alternative notation in the literature:

G □

F ◇

X ○

Examples of LTL formulas

- Invariant (something always holds) :
 - $G(\sim p)$ (\sim is negation)
- Response
 - $G(p \rightarrow F q)$
- Fairness
 - $(G F p) \rightarrow (G F q)$

Examples of LTL formulas

- Invariant (something always holds) :
 - $G(\sim p)$ (\sim is negation)

Safety:

“something bad will not happen”

$$\Box \neg (reactor_temp > 1000)$$

Examples of LTL formulas

Liveness:

“something good will happen”

Typical examples:

$\Diamond rich$

$\Diamond (x > 5)$

$\Box (start \Rightarrow \Diamond terminate)$

and so on.....

Usually: \Diamond

Examples of LTL formulas

Often only really useful when scheduling processes, responding to messages, etc.

Strong Fairness:

“if something is attempted/requested infinitely often, then it will be successful/allocated infinitely often”

Typical example:

$$\Box \Diamond ready \Rightarrow \Box \Diamond run$$

Examples of LTL formulas

An LTL formula is defined inductively as follows:

- Every atomic proposition p is a formula
- If φ_1 and φ_2 are LTL formulas, then $\neg\varphi_1$, $\varphi_1 \vee \varphi_2$,
- $\varphi_1 \wedge \varphi_2$ are also LTL formulas
- $X\varphi_1$ is a formula
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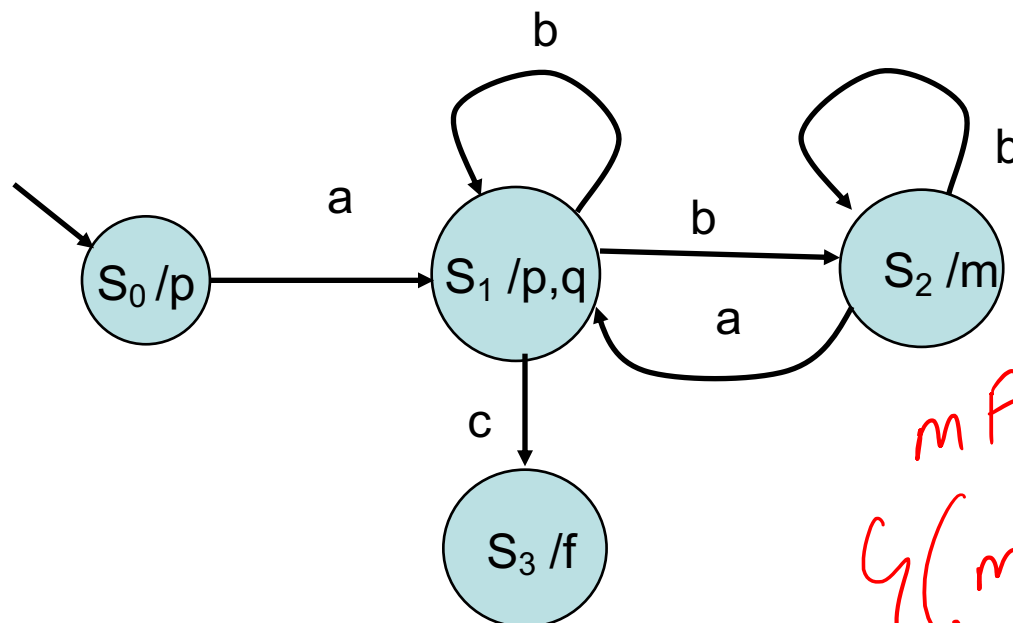
• Which of these are valid LTL formulas?

- $\neg\neg\varphi_1 : \rightarrow \phi \rightarrow \neg(\phi_2) \quad \phi_2 = \neg\phi_1$
- $\neg(\varphi_1 \wedge \varphi_2)$
- $G(\neg\varphi_1 \vee \neg\varphi_1)$

$\hookrightarrow G\phi_2 \rightarrow \phi_2 = Q_3 \vee Q_4 \quad Q_3, Q_4 \rightarrow \neg Q_5, D_r$

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Example specifications in LTL



$m F X F q$
 $G(m \rightarrow Fq)$

STUDENT $G(m \rightarrow Xq)$

$m \rightarrow Xq$

Express these in LTL:

m holds true eventually $\rightarrow Fm$

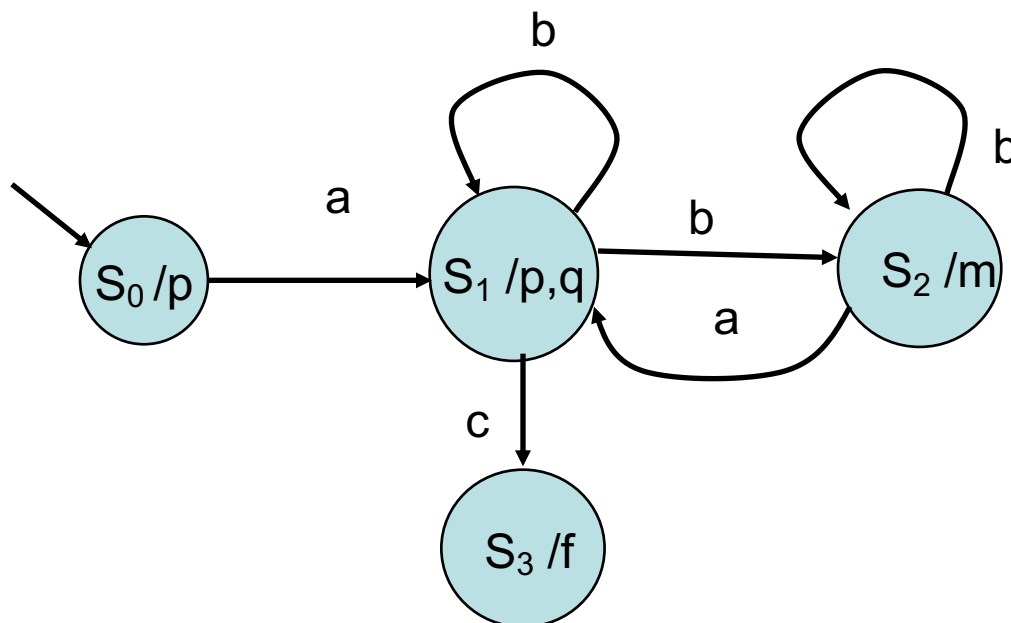
Always, m holds true eventually $\rightarrow G Fm$

\rightarrow m is always followed by q $\rightarrow G(m \rightarrow q)$

p holds continuously before f holds

$p U f$

Example specifications in LTL



Express these in LTL:

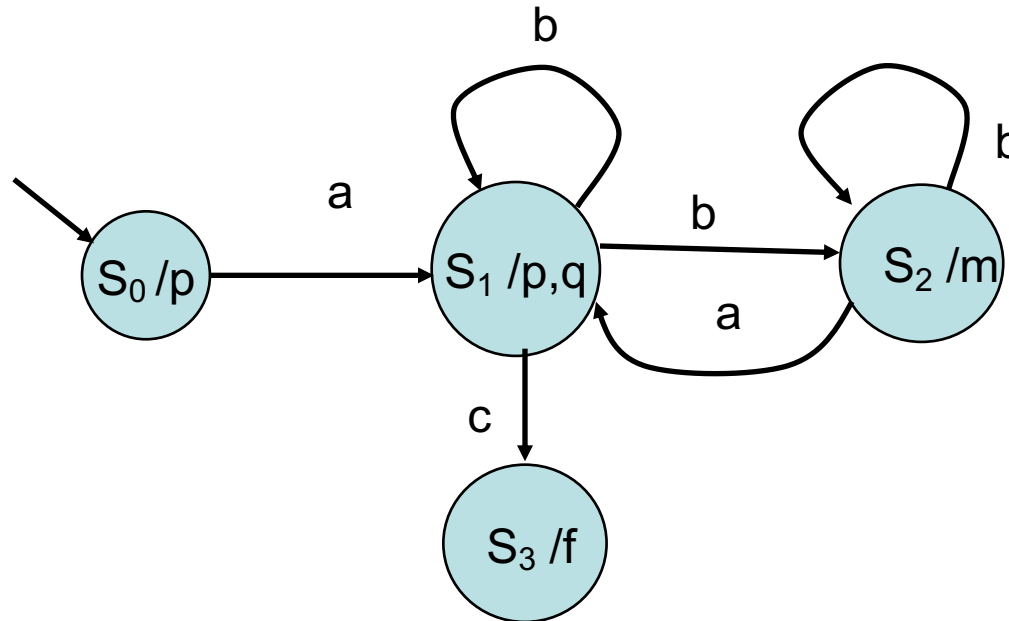
m holds true eventually: Fm

Always, m holds true eventually : GFm

m is always followed by q : $G(m \rightarrow Xq)$

p holds true continuously before f holds true: $p \mathbf{U} f$

Example specifications in LTL



Does the TS satisfy these specifications:

m holds true eventually: Fm

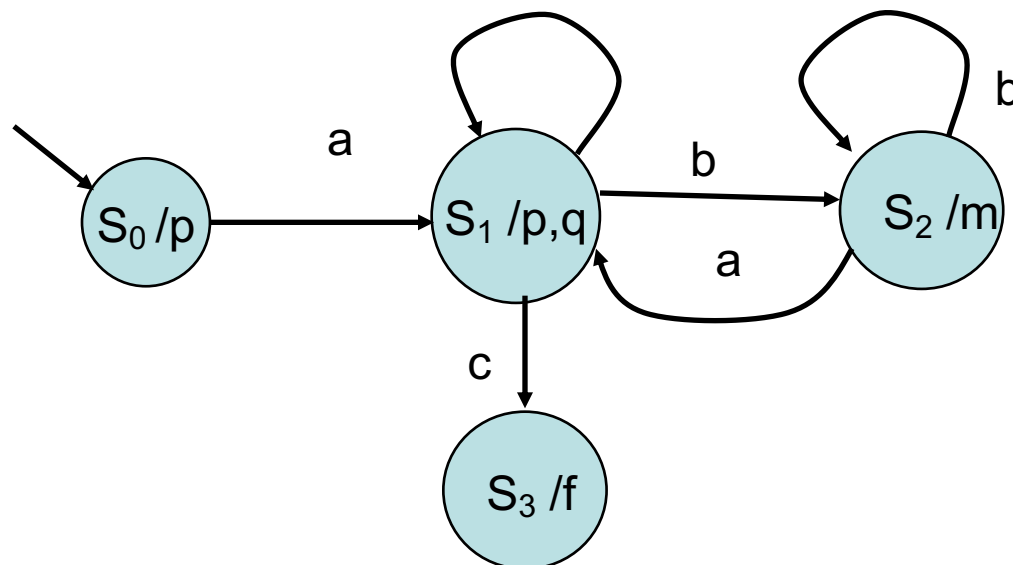
Always, m holds true eventually : GFm

m is always followed by q : $G(m \rightarrow Xq)$

p holds true continuously before f holds true: $p U f$

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Does the TS satisfy these specifications?



Does the TS satisfy these specifications:

m holds true eventually: Fm : No

Always, m holds true eventually : GFm : No

m is always followed by q : $G(m \rightarrow Xq)$: No

p holds continuously before f holds: $p \cup f$: No

Announcements

- No Lectures next week ! (Conference travel)
- Assignment 5 deadline has been extended from Tuesday, Nov 6 to Thursday, Nov 8m 11:59pm.
- A Simulink/Stateflow walkthrough video will be posted in lieu of the lectures next week. It will help with assignment 5.
- Assignment 6 on transition systems and LTL will be out next week on Thursday, Nov 8. It is due in 1 week – on Thursday, Nov 15, at 2:00pm (before the lecture).

LTL to Buchi automata

- We have a system model as a transition system (TS), aka an *automaton*.
- And a specification as an LTL formula
- Recall design principle: try to stick to the same formalism.

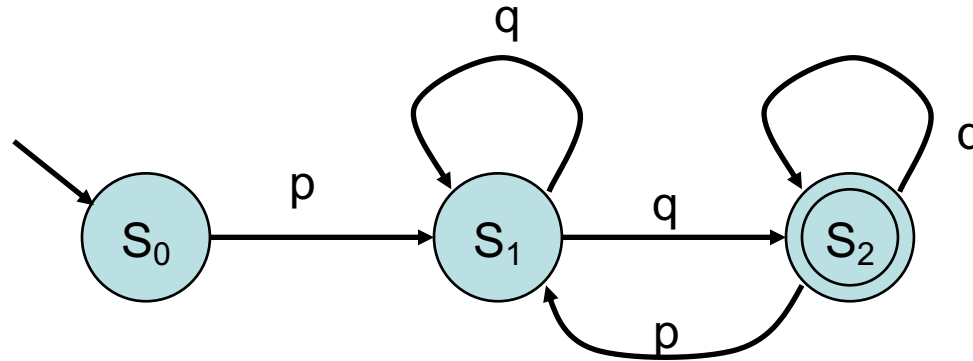
LTL to Buchi automata

- We have a system model as a transition system (TS), aka an *automaton*.
- And a specification as an LTL formula
- Recall design principle: try to stick to the same formalism.
- Every LTL formula has a corresponding *Buchi automaton* that accepts all and only the infinite state traces that satisfy the formula [Vardi and Wolper]

Büchi Automaton

- Automaton which accepts infinite paths
- A **Büchi automaton** is tuple $\langle S, I, A, \delta, F \rangle$
 - S is a finite set of **states** (like a TS)
 - $I \subseteq S$ is a set of **initial states** (like a TS)
 - A is a finite **alphabet** (like a TS)
 - $\delta \subseteq S \times A \times S$ is a **transition relation** (like a TS)
 - $F \subseteq S$ is a set of **accepting states**
- An **infinite sequence of states (a path)** is accepted iff it contains **accepting states (from F) infinitely often**

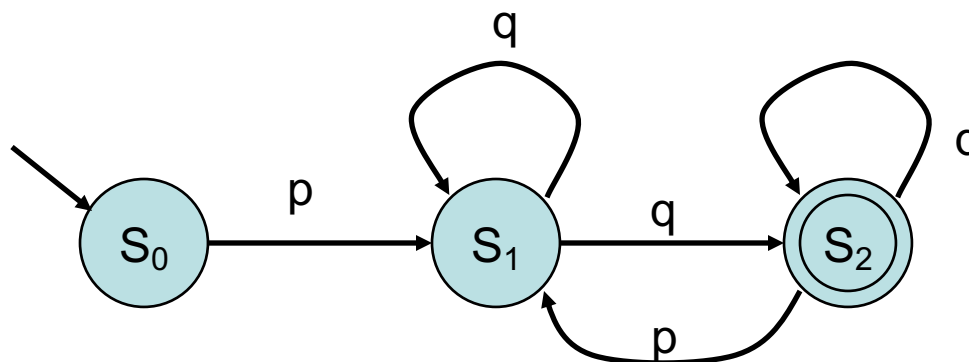
Identify Büchi Automaton components



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- A **Büchi automaton** is tuple $\langle S, I, A, \delta, F \rangle$
 - S is a finite set of **states** (like a TS)
 - $I \subseteq S$ is a set of **initial states** (like a TS)
 - A is a finite **alphabet** (like a TS)
 - $\delta \subseteq S \times A \times S$ is a **transition relation** (like a TS)
 - $F \subseteq S$ is a set of **accepting states**

Example: accepted paths

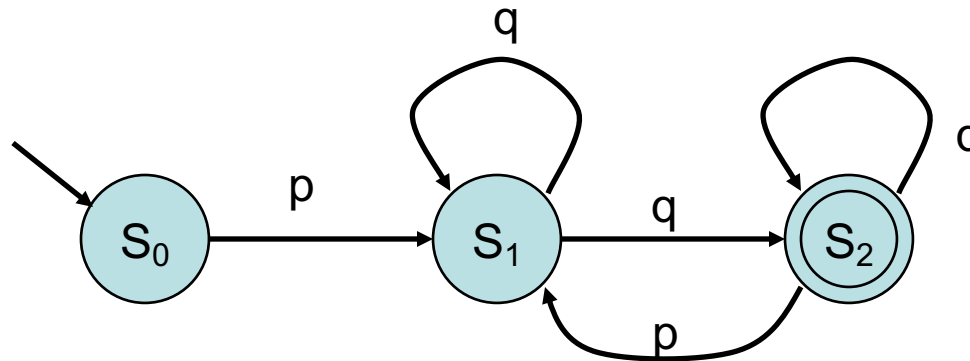


$\sigma_1 = S_0 S_1 S_2 S_2 S_2 S_2 \dots$ **ACCEPTED**

$\sigma_2 = S_0 S_1 S_2 S_1 S_2 S_1 \dots$ **ACCEPTED**

$\sigma_3 = S_0 S_1 S_2 S_1 S_1 S_1 \dots$ **REJECTED**

Example: accepted words



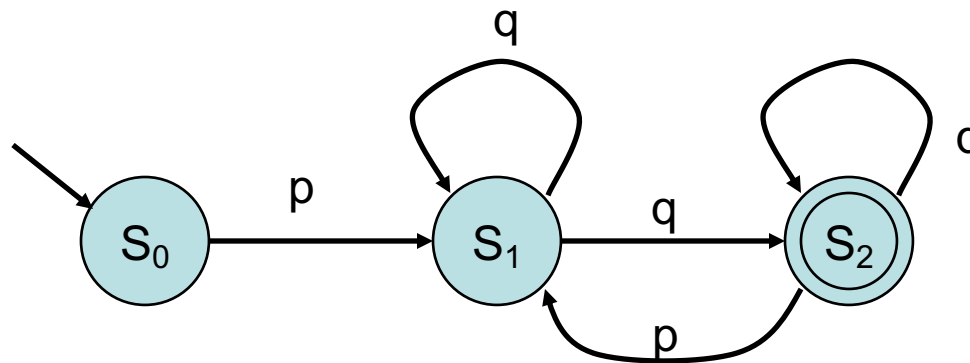
Automaton $B = \langle S, I, A, \delta, F \rangle$

Word = infinite sequence of letters from alphabet A .
E.g. pq^+ and $p(q^*qp)^*$ are both words.

What words are accepted by this automaton?

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Example



Word = infinite sequence of letters from alphabet A .

What words are accepted by this automaton B ?

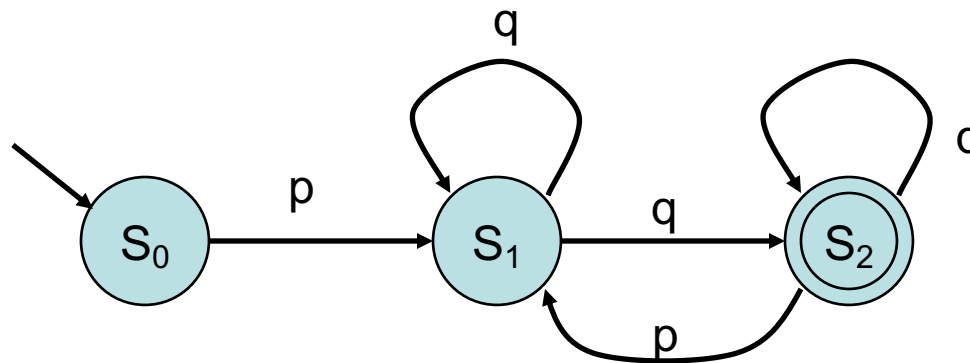
$$L(B) = pq^+(pq^+)^*$$

$L(B)$ is called the language of B . It is the set of words for which there exists **an** accepting run of the automaton.

Non-determinism

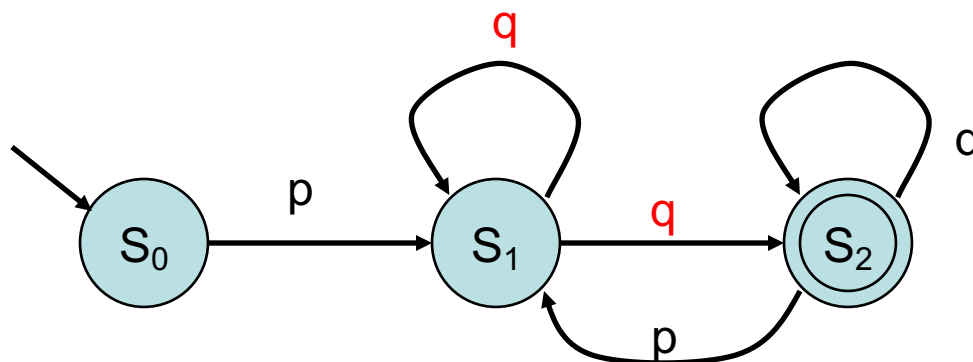
- Büchi automata are **non-deterministic**:
 - The next state is not uniquely defined
 - That is, the same input letter could lead to two different states

Example: Non-determinism



Example of non-determinism?

Example: Non-determinism



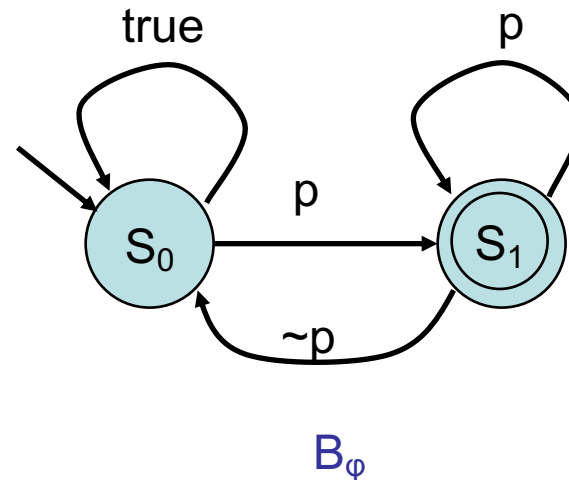
Non-determinism: (s_1, q, s_2) and (s_1, q, s_1) are in the transition relation δ

LTL to Buchi

- Every LTL formula has a corresponding *Buchi automaton* that accepts all and only the infinite state traces that satisfy the formula
- Example: $\varphi = G F p$

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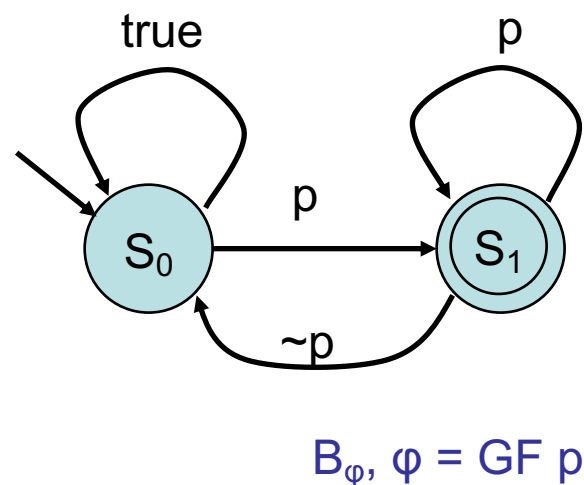
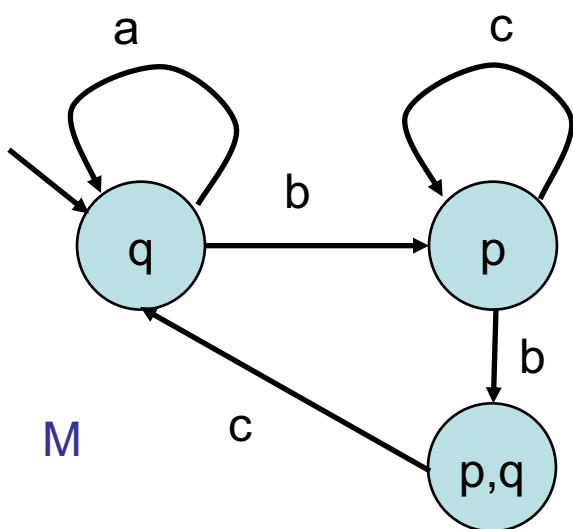


Checkpoint

- Where are we in the story?
 - What are we trying to do?
 - What are the pieces we assembled so far?

LTL Model checking

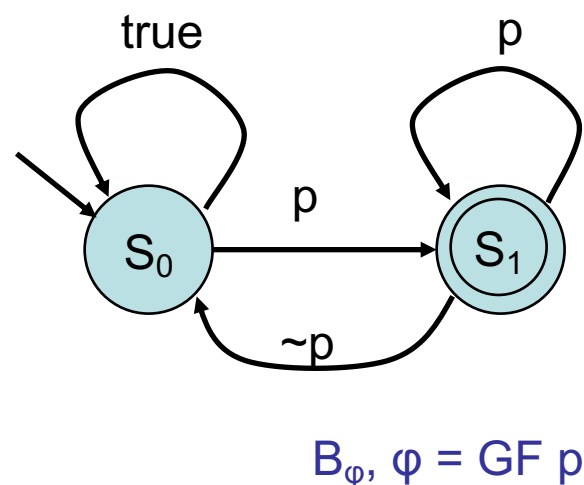
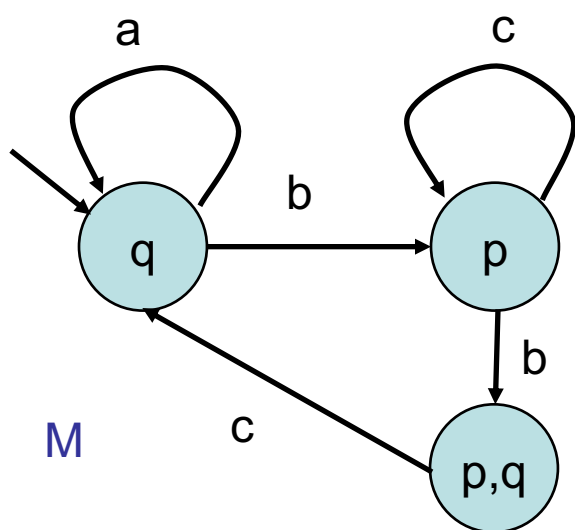
- TS M: input set $A = \{a,b,c\}$ and $AP=\{p,q\}$
- Formula $\varphi = G F p$
- Traces of M = infinite label sequences (e.g. $\sigma_1=(\{q\},\{p\},\{p,q\})^*$ and $\sigma_2=\{q\}^*$)



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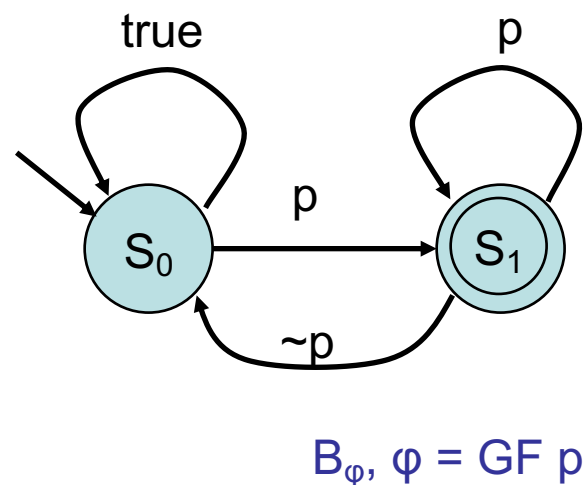
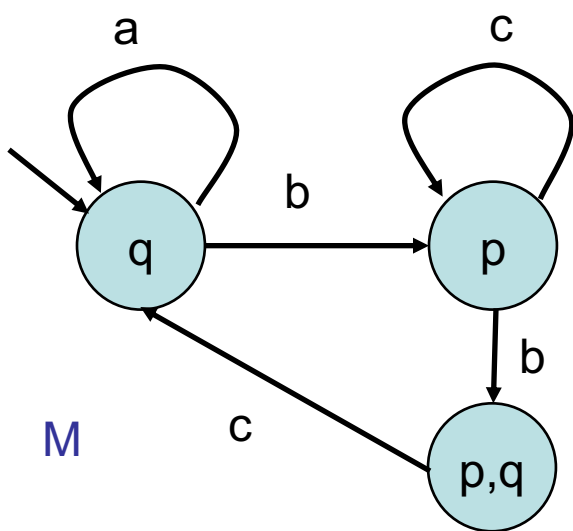
LTL Model checking

- TS M: input set $A = \{a,b,c\}$ and $AP=\{p,q\}$
- Not every trace of M satisfies formula. Give a counter-example



LTL Model checking

- TS M: input set $A = \{a,b,c\}$ and $AP=\{p,q\}$
- Not every trace of M satisfies formula.
Counter-examples: $\sigma_2=\{q\}^*$ and $\sigma_3=qp\{p,q\}q^*$



LTL Model checking

- B_φ accepts exactly those traces that satisfy φ
- $B_{\sim\varphi}$ accepts exactly those traces that falsify (i.e., violate) φ
- Example (cont'd) :

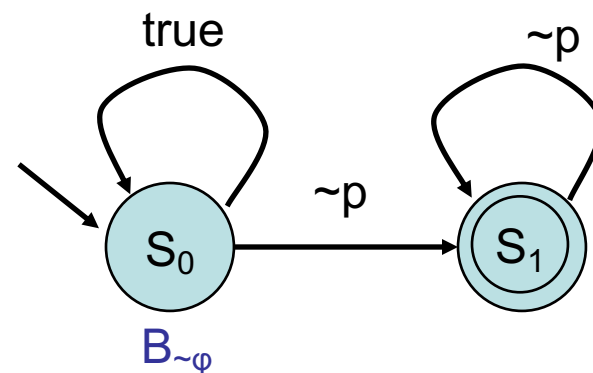
$$\sim\varphi = \sim(GFp) = F\sim(Fp) = F(G\sim p)$$

- What is $B_{\sim\varphi}$?

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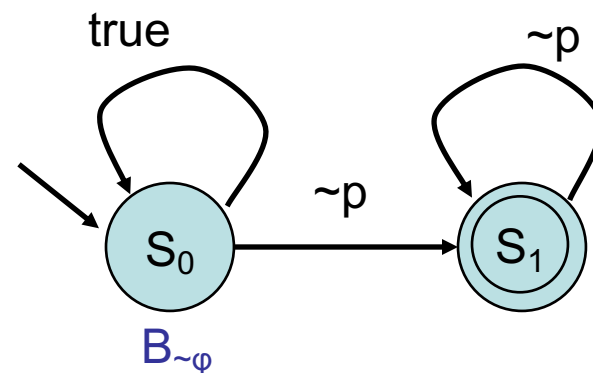
LTL Model checking

- B_φ accepts exactly those traces that satisfy φ
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LTL Model checking

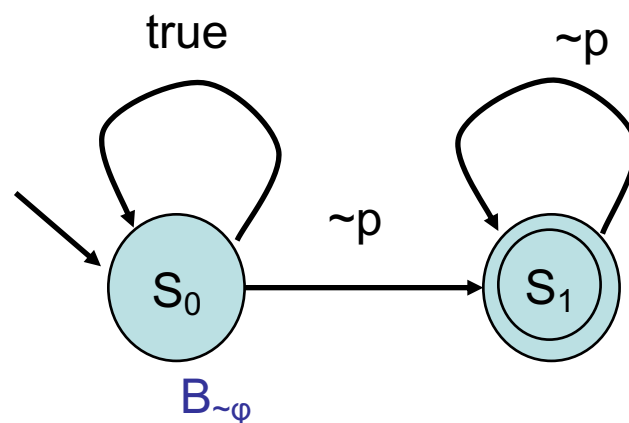
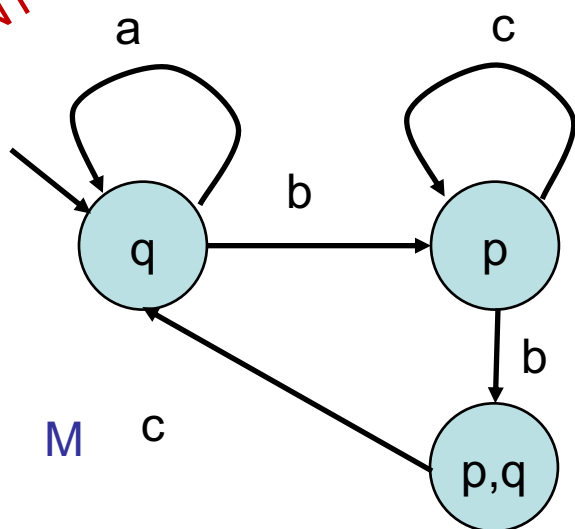
- If TS generates a trace that is accepted by $B_{\sim\varphi}$, this means, by construction, that the trace violates φ , and so that the TS is incorrect (relative to φ)



LTL Model Checking

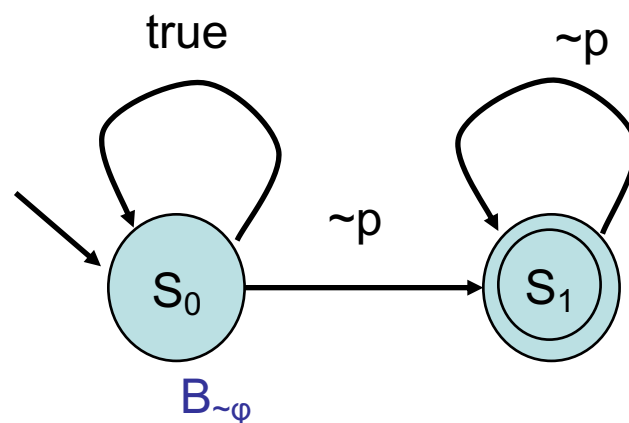
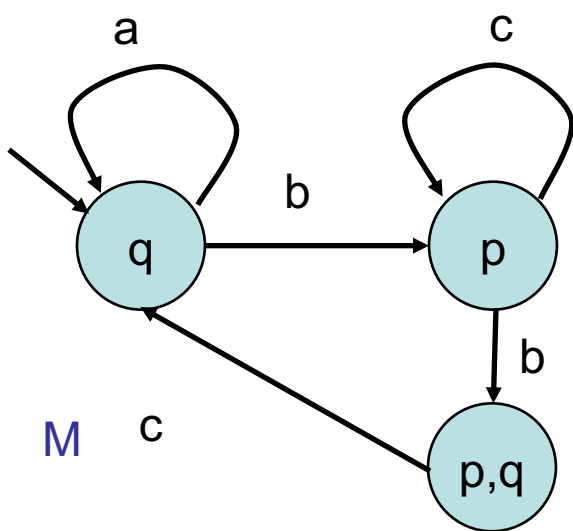
- A trace of TS that is accepted by $B_{\sim\varphi}$ violates φ : TS is incorrect
- Imagine running the two automata in parallel: they both make transitions at the same time. If M transitions $f \rightarrow f'$ (f, f' in AP), $B_{\sim\varphi}$ transitions along the edges labeled by f' . $B_{\sim\varphi}$ observes M 's operation.
- If every/no? such parallel execution is accepting in $B_{\sim\varphi}$, then $M \models \varphi$

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LTL Model Checking

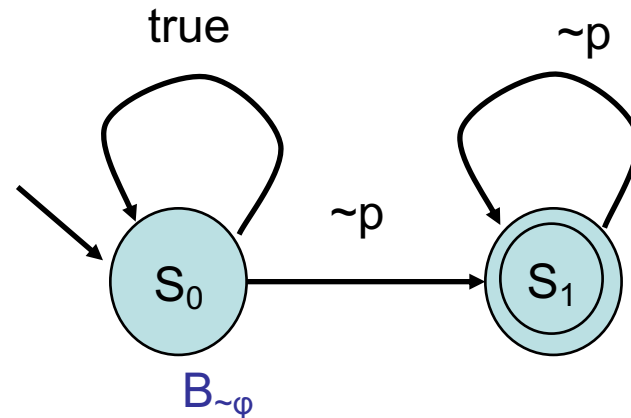
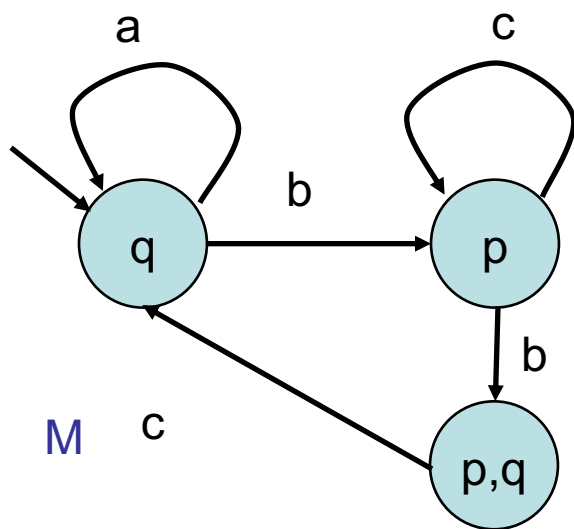
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- If **no** such parallel execution is accepting in $B_{\sim\varphi}$, then $M \models \varphi$



LTL Model Checking

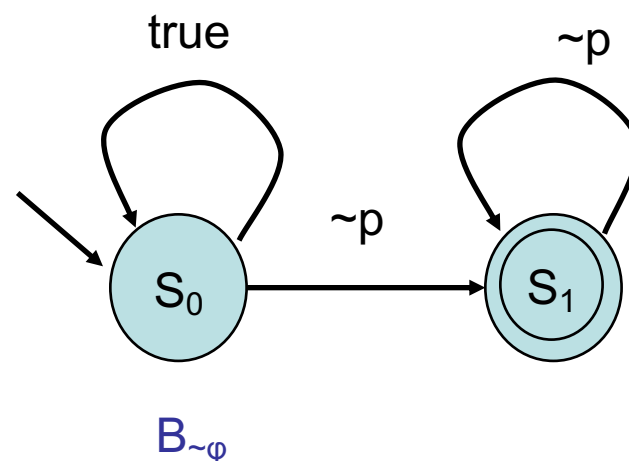
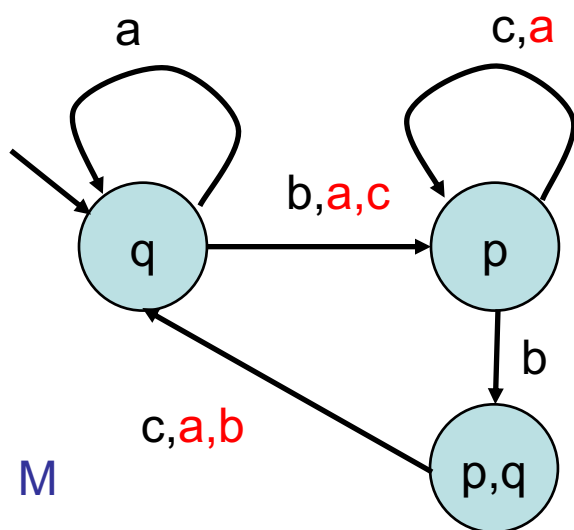
- A trace of TS that is accepted by $B_{\sim\varphi}$ violates φ : TS is incorrect
- Find a counter-example (if any). I.e. a trace of M that is accepted by $B_{\sim\varphi}$

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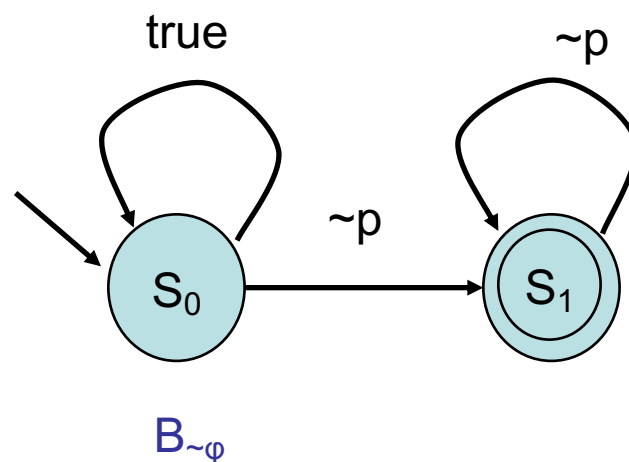
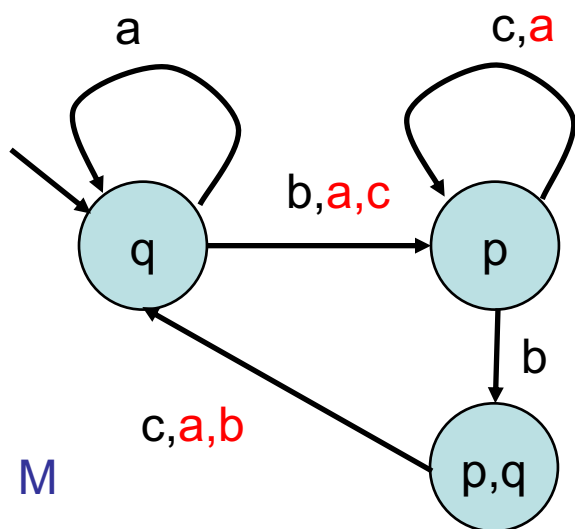
LTL Model Checking

- A trace of TS that is accepted by $B_{\sim\varphi}$ violates φ : TS is incorrect
- Want to run the automata in parallel...



LTL Model Checking

- A trace of TS that is accepted by $B_{\sim\varphi}$ violates φ : TS is incorrect
- Want to run the automata in parallel...
- Take the product automaton!



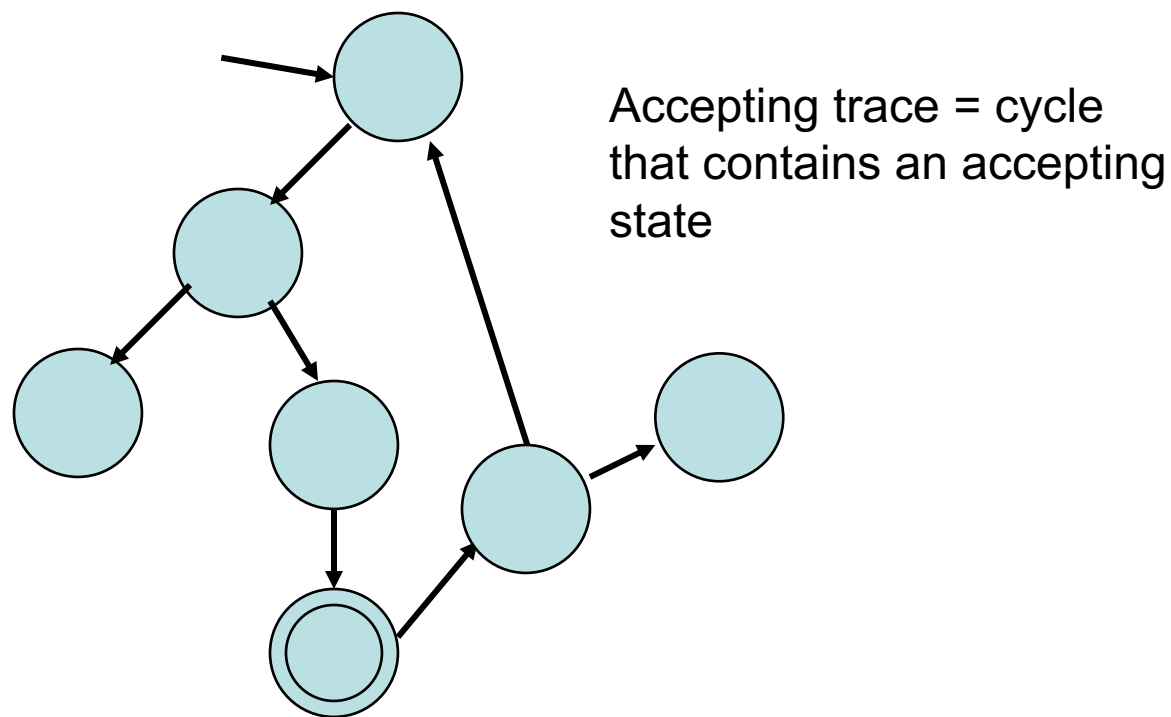
LTL Model Checking

- Given a model M and an LTL formula φ
 - **Build** the Buchi automaton $B_{\sim\varphi}$
 - **Compute product** of M and $B_{\sim\varphi}$
 - Each state of M is labeled with propositions
 - Each state of $B_{\sim\varphi}$ is labeled with propositions
 - Match states with the same labels
 - The product accepts the traces of M that are also traces of $B_{\sim\varphi}$ (i.e. $\text{Tr}(M) \cap L(\sim\varphi)$)
 - If the product accepts any sequence
 - We have found a **counterexample**

Nested Depth First Search

- The product is a Büchi automaton
- How do we find accepted sequences?
 - Accepted sequences **must contain a cycle**
 - In order to contain accepting states infinitely often
 - We are interested only in **cycles that contain at least an accepting state**
 - During depth first search start a **second search** when we are in an **accepting states**
 - If we can reach the same state again we have a cycle (and a **counterexample**)

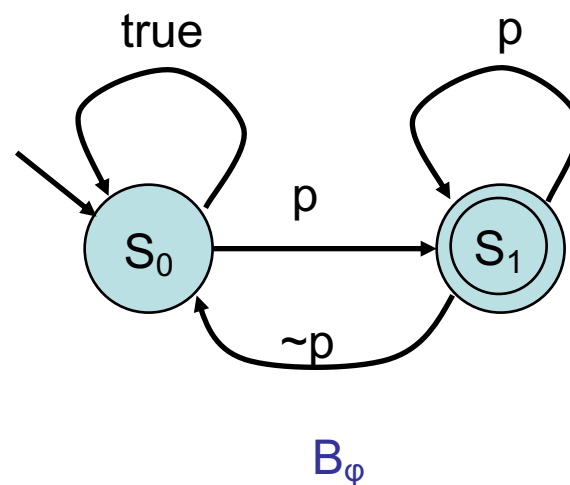
Find an accepting trace



Backup

LTL to Buchi complexity

- Every LTL formula **of size** n has a corresponding *Buchi automaton* of size $2^{O(n)}$ that accepts all and only the infinite state traces that satisfy the formula
- Example: $G F p$



Backup

LTL Model Checking

- Given a **model M** and an LTL **formula φ**
 - Check if **All traces** of M satisfy φ
 - $\text{Tr}(M) \subseteq S^\omega$ is the set of traces of M
 - $L(\varphi) \subseteq (2^{AP})^\omega$ is the language accepted by (the Buchi automaton of) φ
- M satisfies φ if $\text{Tr}(M) \subseteq L(\varphi)$
- Equivalently $\text{Tr}(M) \cap L(\sim\varphi) = \emptyset$