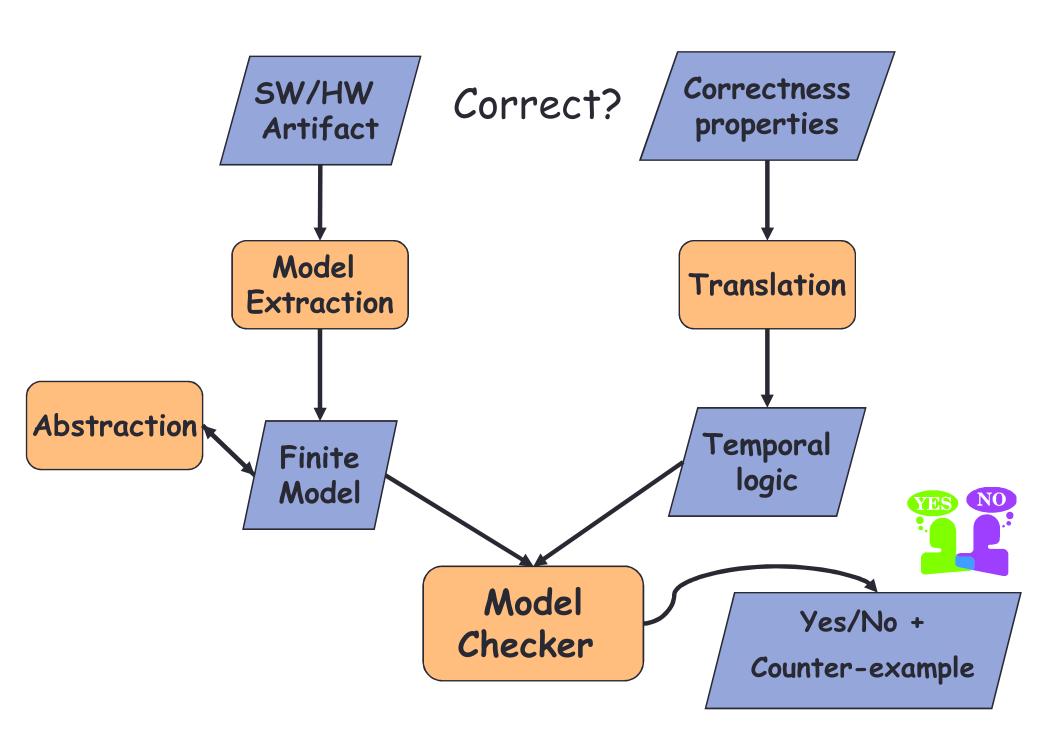
# MODEL CHECKING

Arie Gurfinkel

### Overview

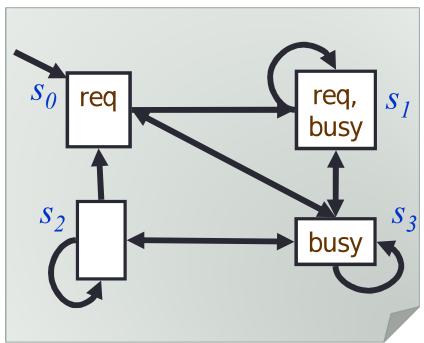
- Kripke structures as models of computation
- CTL, LTL and property patterns
- CTL model-checking and counterexample generation
- State of the Art Model-Checkers



## Models: Kripke Structures

#### Conventional state machines

- $K = (V, S, s_0, I, R)$
- V is a (finite) set of atomic propositions
- S is a (finite) set of states
- $s_0 \in S$  is a start state
- I:  $S \rightarrow 2^V$  is a labelling function that maps each state to the set of propositional variables that hold in it
  - That is, I(S) is a set of interpretations specifying which propositions are true in each state
- R ⊆ S × S is a transition relation



### Propositional Variables

Fixed set of atomic propositions, e.g, {p, q, r}

Atomic descriptions of a system

"Printer is busy"

"There are currently no requested jobs for the printer"

"Conveyer belt is stopped"

Do not involve time!

# Modal Logic

Extends *propositional logic* with modalities to qualify propositions

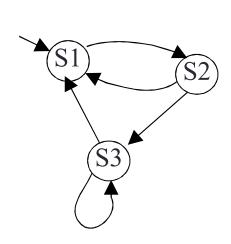
- "it is raining" rain
- "it will rain tomorrow" □ rain
  - it is raining in all possible futures
- "it might rain tomorrow" >rain
  - it is raining in some possible futures

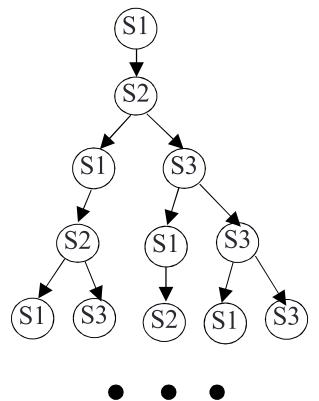
Modal logic formulas are interpreted over a collection of possible worlds connected by an accessibility relation

Temporal logic is a modal logic that adds temporal modalities: next, always, eventually, and until

# Computation Tree Logic (CTL)

CTL: Branching-time propositional temporal logic Model - a tree of computation paths





Kripke Structure

Tree of computation

# CTL: Computation Tree Logic

Propositional temporal logic with explicit quantification over possible futures

#### Syntax:

```
True and False are CTL formulas; propositional variables are CTL formulas;
```

If  $\varphi$  and  $\psi$  are CTL formulae, then so are:  $\neg \varphi$ ,  $\varphi \land \psi$ ,  $\varphi \lor \psi$ 

EX  $\varphi$ :  $\varphi$  holds in some next state

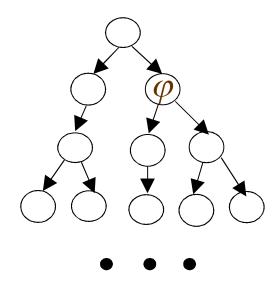
EF  $\varphi$ : along some path,  $\varphi$  holds in a future state

 $E[\varphi \cup \psi]$ : along some path,  $\varphi$  holds until  $\psi$  holds

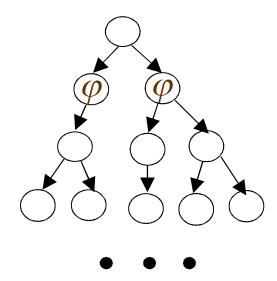
EG  $\varphi$ : along some path,  $\varphi$  holds in every state

• Universal quantification: AX  $\varphi$  , AF  $\varphi$  , A[ $\varphi$  U  $\psi$ ], AG  $\varphi$ 

# Examples: EX and AX

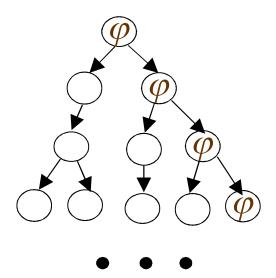


EX  $\varphi$  (exists next)

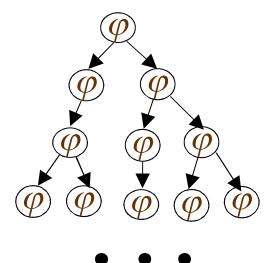


AX  $\varphi$  (all next)

# Examples: EG and AG

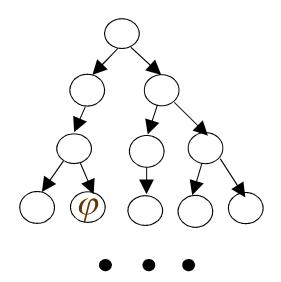


EG  $\varphi$  (exists global)

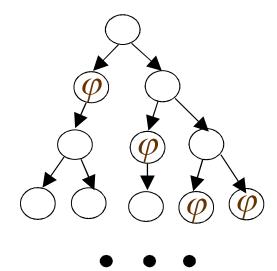


AG  $\varphi$  (all global)

# Examples: EF and AF

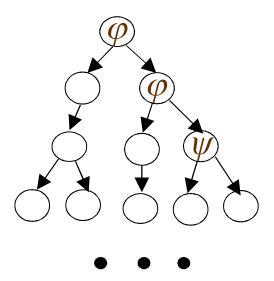


 $\mathbf{EF} \boldsymbol{\varphi}$  (exists future)

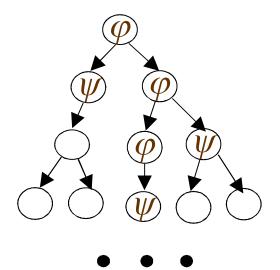


AF  $\varphi$  (all future)

# Examples: EU and AU



 $E[\varphi U \psi]$  (exists until)



 $A[\varphi U \psi]$  (all until)

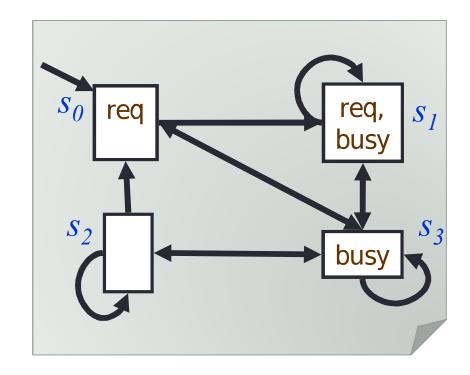
# CTL Examples

#### Properties that hold:

- (AX busy)(s<sub>0</sub>)
- (EG busy)(s<sub>3</sub>)
- A (req U busy) (s<sub>0</sub>)
- E ( $\neg$ req U busy) ( $s_1$ )
- AG (req  $\Rightarrow$  AF busy) ( $s_0$ )

#### Properties that fail:

(AX (req V busy))(s<sub>3</sub>)



## Some Statements To Express

- An elevator can remain idle on the third floor with its doors closed
- When a request occurs, it will eventually be acknowledged
- A process is enabled infinitely often on every computation path
- A process will eventually be permanently deadlocked
- Action s precedes p after q
  - Note: hard to do correctly. See later on helpful techniques

### Semantics of CTL

 $K,s \models \varphi$  – means that formula  $\varphi$  is true in state s. K is often omitted since we always talk about the same Kripke structure

```
• E.g., s \models \rho \land \neg q

\pi = \pi^0 \pi^1 \dots is a path

\pi^0 is the current state (root)

\pi^{i+1} is a successor state of \pi^i. Then,

AX \varphi = \forall \pi \cdot \pi^1 \models \varphi

AG \varphi = \forall \pi \cdot \forall i \cdot \pi^i \models \varphi

AF \varphi = \forall \pi \cdot \exists i \cdot \pi^i \models \varphi
```

$$AX \varphi = \forall \pi \cdot \pi^{1} \vDash \varphi$$

$$AG \varphi = \forall \pi \cdot \forall i \cdot \pi^{i} \vDash \varphi$$

$$AF \varphi = \forall \pi \cdot \exists i \cdot \pi^{i} \vDash \varphi$$

$$EG \varphi = \exists \pi \cdot \forall i \cdot \pi^{i} \vDash \varphi$$

$$EF \varphi = \exists \pi \cdot \exists i \cdot \pi^{i} \vDash \varphi$$

$$A[\varphi \cup \psi] = \forall \pi \cdot \exists i \cdot \pi^{i} \vDash \psi \land \forall j \cdot 0 \le j < i \Rightarrow \pi^{j} \vDash \varphi$$

$$E[\varphi \cup \psi] = \exists \pi \cdot \exists i \cdot \pi^{i} \vDash \psi \land \forall j \cdot 0 \le j < i \Rightarrow \pi^{j} \vDash \varphi$$

### Relationship Between CTL Operators

```
\neg AX \varphi = EX \neg \varphi
      \neg AF \varphi = EG \neg \varphi
                                                                             \neg \mathsf{EF} \varphi = \mathsf{AG} \neg \varphi
        AF\varphi = A[true U \varphi]
                                                                             \mathsf{EF}\varphi = \mathsf{E}[\mathsf{true}\;\mathsf{U}\;\varphi]
       AG \varphi = \varphi \wedge AX AG \varphi
                                                                               EG \varphi = \varphi \land EX EG \varphi
                                                                              \mathsf{EF} \ \varphi = \varphi \ \mathsf{V} \ \mathsf{EX} \ \mathsf{EF} \ \varphi
       AF \varphi = \varphi \lor AX AF \varphi
A [false U \varphi] = E[false U \varphi] = \varphi
A[\varphi \cup \psi] = \neg E[\neg \psi \cup (\neg \varphi \land \neg \psi)] \land \neg EG \neg \psi
 A[\varphi \cup \psi] = \psi \vee (\varphi \wedge AX A[\varphi \cup \psi])
 E[\varphi \cup \psi] = \psi \vee (\varphi \wedge EX E[\varphi \cup \psi])
 A[\varphi W \psi] = \neg E[\neg \psi U (\neg \varphi \land \neg \psi)] (weak until)
   \mathsf{E}[\varphi \cup \psi] = \neg \mathsf{A}[\neg \psi \mathsf{W} (\neg \varphi \land \neg \psi)]
```

## Adequate Sets

<u>Def.</u> A set of connectives is adequate if all connectives can be expressed using it.

- e.g., {¬,∧} is adequate for propositional logic:
  - $a \lor b = \neg (\neg a \land \neg b)$

Theorem. The set of operators {false,¬, ∧} together with EX, EG, and EU is adequate for CTL

- e.g., AF  $(a \lor AX b) = \neg EG \neg (a \lor AX b) = \neg EG (\neg a \land EX \neg b)$
- EU describes reachability
- EG non-termination (presence of infinite behaviours)

### Universal and Existential CTL

- A CTL formula is in ACTL if it uses only universal temporal connectives (AX, AF, AU, AG) with negation applied to the level of atomic propositions
  - Also called "universal" CTL formulas
  - e.g., A [p U AX ¬q]
- ECTL: uses only existential temporal connectives (EX, EF, EU, EG) with negation applied to the level of atomic propositions
  - Also called "existential" CTL formulas
  - e.g., E [p U EX ¬q]
- CTL formulas not in ECTL U ACTL are called "mixed"
  - e.g., E [p U AX  $\neg q$ ] and A [p U EX  $\neg q$ ]

# Safety and Liveness

Safety: Something "bad" will never happen

- AG ¬bad
- e.g., mutual exclusion: no two processes are in their critical section at once
- Safety = if false then there is a finite counterexample

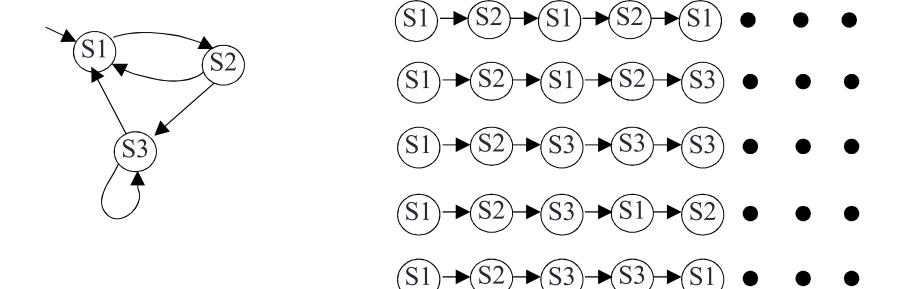
Liveness: Something "good" will always happen

- AG AF good
- e.g., every request is eventually serviced
- Liveness = if false then there is an infinite counterexample

Every universal temporal logic formula can be decomposed into a conjunction of safety and liveness

# Linear Temporal Logic (LTL)

For reasoning about complete traces through the system



Allows to make statements about a trace

# LTL Syntax

- If  $\varphi$  is an atomic propositional formula, it is a formula in LTL
- If  $\varphi$  and  $\psi$  are LTL formulas, so are  $\varphi \land \psi$ ,  $\varphi \lor \psi$ ,  $\neg \varphi$ ,  $\varphi$  U  $\psi$  (until), X  $\varphi$  (next), F $\varphi$  (eventually), G  $\varphi$  (always)
- Interpretation: over computations  $\pi$ :  $\omega \Rightarrow 2^V$  which assigns truth values to the elements of V at each time instant

```
\pi \models X \varphi iff \pi^1 \models \varphi
\pi \models G \varphi iff \forall i \cdot \pi^i \models \varphi
\pi \models F \varphi iff \exists i \cdot \pi^i \models \varphi
\pi \models \varphi \cup \psi iff \exists i \cdot \pi^i \models \psi \land \forall j \cdot 0 \leq j < i \Rightarrow \pi^j \models \varphi
Here, \pi^i is the i th state on a path
```

## Properties of LTL

$$\neg X \varphi = X \neg \varphi$$

$$F \varphi = \text{true } U \varphi$$

$$G \varphi = \neg F \neg \varphi$$

$$G \varphi = \varphi \land X G \varphi$$

$$F \varphi = \varphi \lor X F \varphi$$

$$\varphi W \psi = G \varphi \lor (\varphi U \psi) \quad \text{(weak until)}$$

A property holds in a model if it holds on every path starting from the initial state

# **Expressing Properties in LTL**

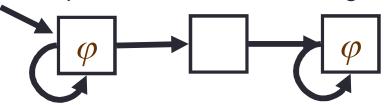
- Good for safety (G ¬) and liveness (F) properties
- Express:
  - When a request occurs, it will eventually be acknowledged
  - Each path contains infinitely many q's
  - <del>r At most a nime number of states in each path sa</del>tisfy ⊸*q* (or property *q* eventually stabilizes)
  - Action s precedes p after q
    - <del>• Note. Hard to do correctiy. See later on helpful ted</del>hniques

## Comparison between LTL and CTL

Syntactically: LTL is simpler than CTL

Semantically: incomparable!

- CTL formula AG EF  $\varphi$  (always can reach) is not expressible in LTL
- LTL formula F G  $\varphi$  (eventually always) is not expressible in CTL
  - What about AF AG  $\varphi$ ?
  - Has different interpretation on the following state machine:



- AF AG  $\varphi$  is false
- F G  $\varphi$  is true

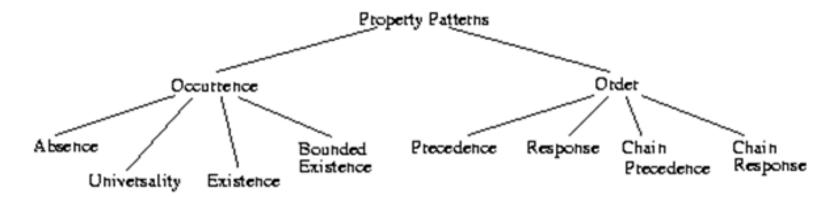
The logic CTL\* is a super-set of both CTL and LTL LTL and CTL coincide if the model has only one path!

### **Property Patterns: Motivation**

- Temporal properties are not always easy to write or read
  - e.g., G  $((q \land \neg r \land F r) \Rightarrow (p \Rightarrow (\neg r \cup (s \land \neg r)) \cup r)$
  - Meaning:
    - p triggers s between q (e.g., end of system initialization) and r (start of system shutdown)
- Many properties are specifiable in both CTL and LTL
  - e.g., Action q must respond to action p:
    - CTL: AG  $(p \Rightarrow AF q)$
    - LTL: G  $(p \Rightarrow F q)$
  - e.g., Action s precedes p after q
    - CTL:  $A[\neg q \cup (q \land A[\neg p \cup s])]$
    - LTL:  $[\neg q \cup (q \land [\neg p \cup s])]$

# Pattern Hierarchy

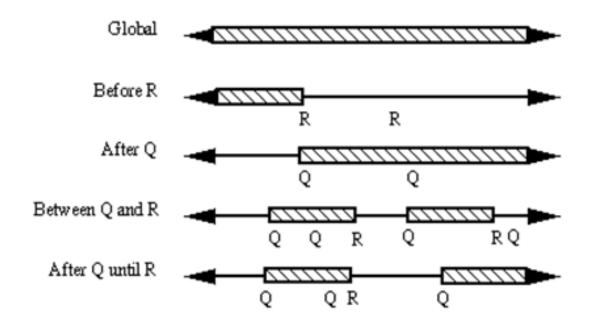
<a href="http://patterns.projects.cis.ksu.edu/">http://patterns.projects.cis.ksu.edu/</a>
Specifying and reusing property specifications



- Absence: A condition does not occur within a scope
- Existence: A condition must occur within a scope
- Universality: A condition occurs throughout a scope
- Response: A condition must always be followed by another within a scope
- Precedence: A condition must always be preceded by another within a scope

# Pattern Hierarchy: Scopes

Scopes of interest over which the condition is evaluated



# Using the System: Example

- Property
  - There should be a dequeue() between an enqueue() and an empty()
  - Propositions: deq, enq, em
- Pattern: "existence" (of deq)
  - Scope: "between" (events: enq, em)
  - Look up (S exists between Q and R)
    - CTL: AG  $(Q \land \neg R \Rightarrow A[\neg R \lor (S \land \neg R)])$
    - LTL: G  $(Q \land \neg R \Rightarrow (\neg R \lor (S \land \neg R)))$
- Result
  - CTL: AG (enq  $\land \neg$  em  $\Rightarrow$  A[ $\neg$  em W (deq  $\land \neg$  em)])
  - LTL: G (enq  $\land \neg$  em  $\Rightarrow$  ( $\neg$  em W (deq  $\land \neg$  em)))

# CTL Model-Checking

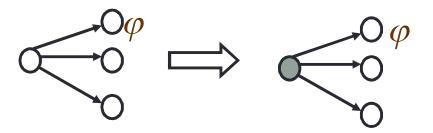
- Inputs:
  - Kripke structure K
  - CTL formula  $\varphi$
- Assumptions:
  - The Kripke structure is finite
  - Finite length of a CTL formula
- Algorithm:
  - Working outwards towards  $\varphi$
  - Label states of K with sub-formulas of  $\varphi$  that are satisfied these states
  - Output states labeled with  $\varphi$

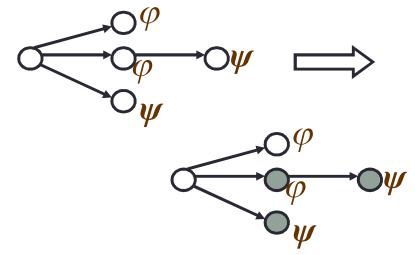
Example: EX EG  $(p \Rightarrow E[p \cup q])$ 

# CTL Model-Checking (EX, EU)

#### $\mathsf{EX} \ \varphi$

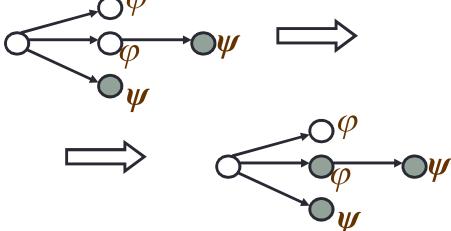
• Label a state EX  $\varphi$  if any of its successors is labeled with  $\varphi$ 





#### $E [\varphi \cup \psi]$

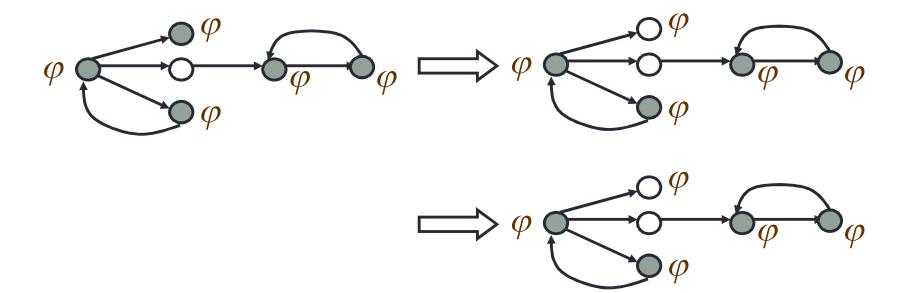
- Label a state  $E[\varphi \cup \psi]$  if it is labeled with  $\psi$
- Until there is no change
  - label a state with E[φ U ψ]
     if it is labeled with φ and
     has a successor labeled
     with E[φ U ψ]



# CTL Model-Checking (EG)

#### $\mathsf{EG} \, \varphi$

- Label every node labeled with  $\varphi$  by EG  $\varphi$
- Until there is no change
  - remove label EG  $\varphi$  from any state that does not have successors labeled by EG  $\varphi$



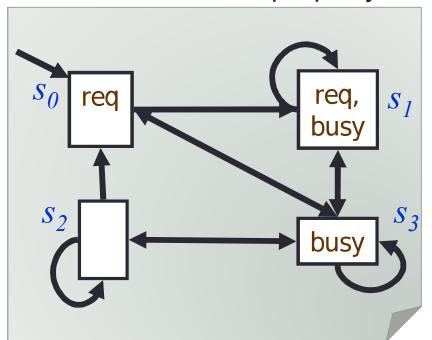
# Counterexamples

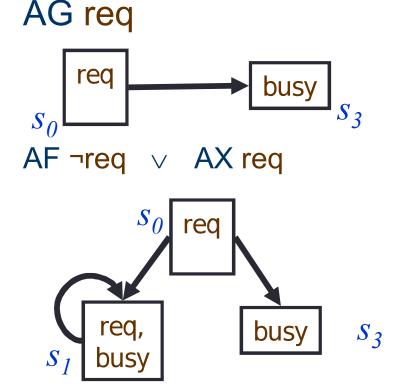
#### Explain why the property fails to hold

- to disprove that  $\phi$  holds on all elements of S, produce a single element  $s \in S$  s.t.  $\neg \phi$  holds on s.
  - counterexamples are restricted to universally-quantified formulas

• counterexamples are paths (trees) from initial state illustrating

the failure of property

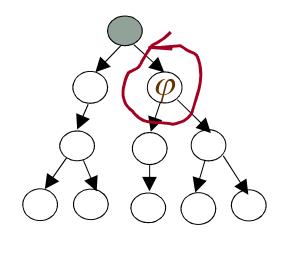




### Generating Counterexamples (EX, EG)

Negate the prop. and express using EX, EU, EG

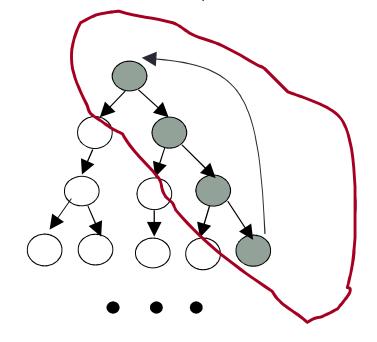
• e.g., AG  $(\varphi \Rightarrow AF \psi)$  becomes  $EF(\varphi \land EG \neg \psi)$ 



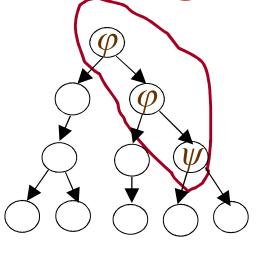
 $\mathsf{EX}\ \varphi$  :

find a successor state labeled with  $\varphi$ 

EG  $\varphi$ : follow successors labeled with EG  $\varphi$  until a loop is found



# Generating Counterexamples (EU)



#### $E[\varphi \cup \psi]$ :

remove all states that are not labeled with either  $\varphi$  or  $\psi$ . Then, find a path to  $\psi$ 

This procedure works only for universal properties

- ΑΧ *φ*
- AG  $(\varphi \Rightarrow AF \psi)$
- etc.

## State Explosion

- How fast do Kripke structures grow?
   Composing linear number of structures yields exponential growth!
- How to deal with this problem?
  - Symbolic model checking with efficient data structures (BDDs, SAT).
    - Do not need to represent and manipulate the model explicitly
  - Abstraction
    - Abstract away variables in the model which are not relevant to the formula being checked
  - Partial order reduction (for asynchronous systems)
    - Several interleavings of component traces may be equivalent as far as satisfaction of the formula to be checked is concerned
  - Composition
    - Break the verification problem down into several simpler verification problems

### Model-Checking Techniques (Symbolic)

#### BDD

- Express transition relation by a formula, represented as BDD.
   Manipulate these to compute logical operations and fixpoints
- Based on very fast decision diagram packages (e.g., CUDD)

#### SAT

- Expand transition relation a fixed number of steps (e.g., loop unrolling), resulting in a formula
- For this unrolling, check whether the property holds
- Continue increasing the unrolling until error is found, resources are exhausted, or diameter of the problem is reached
- Based on very fast SAT solvers

### Model-Checking Techniques (Explicit State)

- Model checking as partial graph exploration
- In practice:
  - Compute part of the reachable state-space, with clever techniques for state storage (e.g., Bit-state hashing) and path pruning (partialorder reduction)
  - Check reachability (X, U) properties "on-the-fly", as state-space is being computed
  - Check non-termination (G) properties by finding an accepting cycle in the graph

## Pros and Cons of Model-Checking

- Often cannot express full requirements
  - Instead check several smaller properties
- Few systems can be checked directly
  - Must generally abstract
- Works better for certain types of problems
  - Very useful for control-centered concurrent systems
    - Avionics software
    - Hardware
    - Communication protocols
  - Not very good at data-centered systems
    - User interfaces, databases

# Pros and Cons (Cont'd)

- Largely automatic and fast
- Better suited for debugging
  - · ... rather than assurance
- Testing vs model-checking
  - Usually, find more problems by exploring all behaviours of a downscaled system than by

testing some behaviours of the full system

#### Some State of the Art Model-Checkers

- SMV, NuSMV, Cadence SMV
  - CTL and LTL model-checkers
  - Based on symbolic decision diagrams or SAT solvers
  - Mostly for hardware and other models
- Spin
  - LTL model-checker
  - Explicit state exploration
  - Mostly for communication protocols
- CBMC, SatAbs, CPAChecker, UFO
  - Combine Model Checking and Abstraction
  - Work directly on the source code (mostly C)
  - Control-dependent properties of programs (buffer overflow, API usage, etc.)