

# Model Checking and Games

Part IX - Summary

Rüdiger Ehlers, Clausthal University of Technology

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# Safety of systems

## Driving question of this course

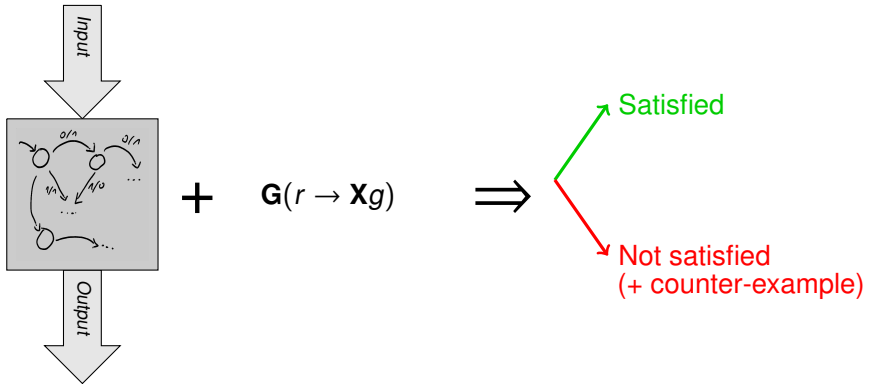
**How can we ensure that a *reactive* system does what it is supposed to be doing?**

## Secondary driving question of this course

**...And how can we automate what we do to achieve this to the greatest extent possible?**

# Verification and Synthesis

## Verification:



# Verification and Synthesis

## Synthesis:

$$G(r \rightarrow Xg)$$

+

Input =  $\{r, \dots\}$

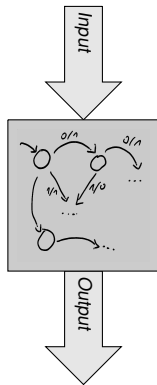
Output =  $\{g, \dots\}$



Realizable



Not realizable



# Structure of this course

## Basics

- 1 Modelling reactive systems
- 2 Modelling specifications
- 3 Verifying specifications against models

## Tools

Spin

## Symbolic verification

- 1 Binary decision diagrams / Algorithms for BDDs
- 2 Satisfiability solving & Bounded Model checking

## Tools

(dd/GUDD)  
Alloy

## Reactive synthesis

- 1 Introduction to reactive synthesis

## Tools

Slugs

## Model checking vs. testing

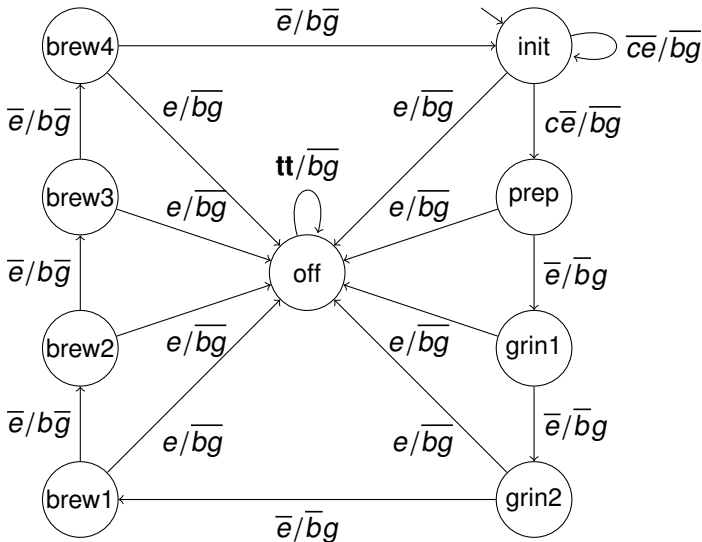
### Advantages of testing

- It utilizes the system to test directly, no need to build a model
- Test cases are natural to write for programmers

### Advantages of model checking

- Guarantees to find *all* bugs in the model

## Example: Coffee machine



## Kripke structures: *Labeled transition systems*

### Definition

A *Kripke structure* is a tuple  $(S, S_0, T, AP, L)$  with:

- a set of states  $S$ ,
- a set of initial states  $S_0$ , and
- a set of transitions  $T \subseteq S \times S$ .
- a set of *propositions*  $AP$ , and
- a labelling function  $L : S \rightarrow 2^{AP}$ .



## Comparison: LTS vs Mealy & Moore machines

### Comparison

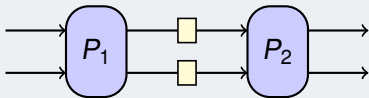
<b>Aspect</b>	<b>Mealy / Moore Machines</b>	<b>Labeled Transition systems</b>
Input & Output	Clearly separated	No separation
Determinism	Yes	No
Time	Discrete time steps	No concrete notion of time
Ability to abstract from details	No	Yes
Non-binary alphabets	Yes	No

## Synchronous communication between processes

Possibility 1: Synchronous composition in the same time step



Possibility 2: Synchronous composition with delay



# Linear temporal logic

## Basic properties

- Originally introduced by Pnueli (1977)
- It is a logic on *infinite words* over the alphabet  $2^{AP}$  for some set of atomic propositions  $AP \rightarrow$  can be used to reason about traces of a system

## Use in verification

We can use LTL to express properties that we want to hold along *all* traces of a system. Examples:

- Every *green light* of a traffic light should eventually be followed by a *yellow light*.
- For every direction  $d$ , the traffic light implementation should permit a future execution such that there is a green light for direction  $d$ .

Did we define all important components?

$\phi$     $\models$     $\psi$

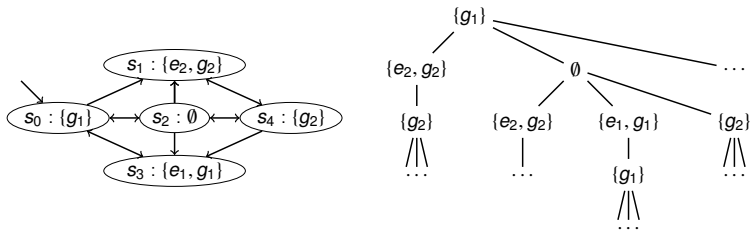
Kripke  
Structures

Linear temporal  
logic

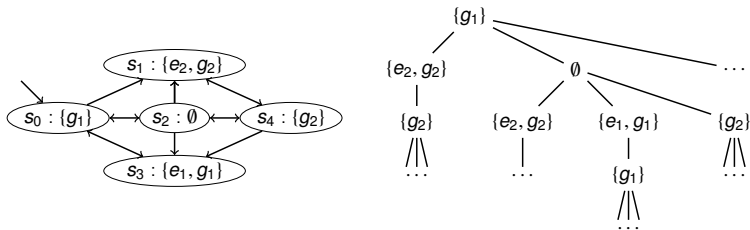
### Observation

That does not fit! LTL is defined over words, not transition systems!

## Unrolling a transition system to a tree (assuming a single initial state)



## Unrolling a transition system to a tree (assuming a single initial state)



### LTL interpretation

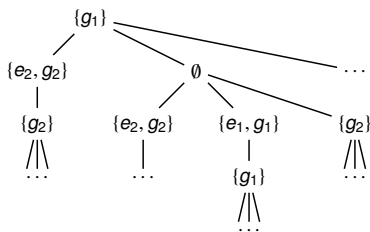
An LTL specification is checked along every *branch* in the computation tree!

# Computation tree logic

## Basic properties

- Originally introduced by Clarke and Emerson (1981)
- Is a logic over *trees with infinite branches*
- Extends propositional logic

## Examples for CTL



### Property

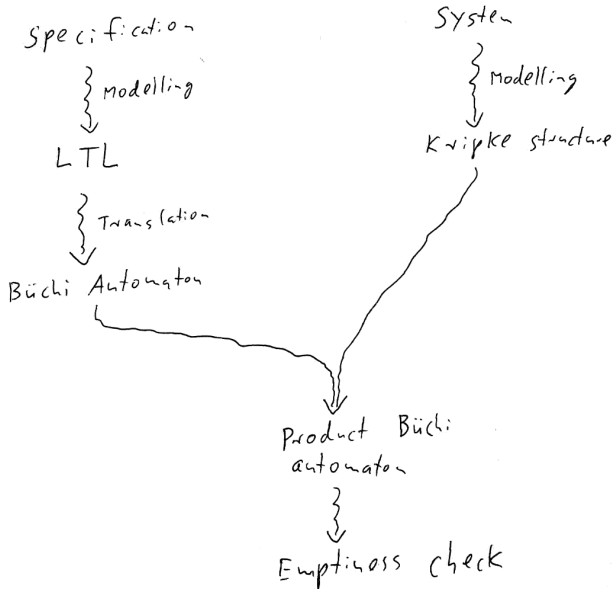
There exists a trace on which when  $g_1$  is true for the first time,  $g_1$  can stay true together with  $e_2$  immediately afterwards.

### In CTL

$\mathbf{E}(\neg g_1 \mathcal{U} (g_1 \wedge \mathbf{EX}(g_1 \wedge e_2)))$

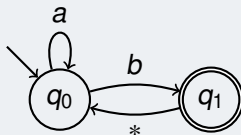


# Overview



## Büchi automata by example

Example automaton 1 for  $\Sigma = \{a, b\}$



An example *run* of the automaton for a word

$\rho =$	$a$	$b$	$a$	$a$	$a$	$b$	$a$	$a$	$b$	$b$	$b$	$\dots$
$\pi =$	$q_0$	$q_0$	$q_1$	$q_0$	$q_0$	$q_0$	$q_1$	$q_0$	$q_0$	$q_1$	$q_0$	$q_1 \dots$

## Product construction – formal definition

### Definition

Let  $\mathcal{K} = (S, AP, S_0, T, L)$  be a Kripke structure and  $\mathcal{A} = (Q, \Sigma, Q_0, \delta, F)$  be a Büchi automaton with  $\Sigma = 2^{AP}$ . We define the product Büchi automaton  $\mathcal{B} = (Q', \Sigma, Q'_0, \delta', F')$  with:

- $Q' = S \times Q$
- $Q'_0 = S_0 \times Q_0$
- $\delta' = \{((q, s), x, (q', s')) \in Q' \times \Sigma \times Q' \mid (q, x, q') \in \mathcal{A}, (s, s') \in T, L(s) = x\}$
- $F = S \times F$

### Proposition (without proof here)

$\mathcal{B}$  accepts exactly those words that accepted by  $\mathcal{A}$  **and** are traces of  $\mathcal{K}$  at the same time.

# Checking Büchi automata language emptiness

A classical question in automata theory

Can we check an automaton for *language emptiness*?

Automata over finite words

We can test this by checking if there exists a reachable accepting state.

Automata over infinite words

We can test this by checking if there exists an accepting *lasso*.

A lasso consists of a *lasso handle* and a *lasso cycle*, where the lasso cycle contains at least one accepting state.

# The double-DFS algorithm

## Shared variables

```
stack = []  
stackB = []  
visited = set([])  
marked = set([])
```

## First DFS

```
def dfsA(node):  
    if node in visited:  
        return  
    stack.push(node)  
    visited.add(node)  
    for all  $(v, v') \in E$  with  $v == \text{node}$ :  
        dfsA(v')  
    if  $v \in F$ :  
        dfsB(v')  
    stack.pop()
```

## Second DFS

```
def dfsB(node):  
    if node in marked:  
        return  
    stackB.push(node)  
    marked.add(node)  
    for all  $(v, v') \in E$  with  $v == \text{node}$ :  
        if  $v' \in \text{stack}$ :  
            lasso found  
        dfsB(v')  
    stackB.pop()
```

## Calling dfsa

```
for all  $v \in Q_0$ :  
    dfsA(v)
```

# Translating from LTL to Büchi automata

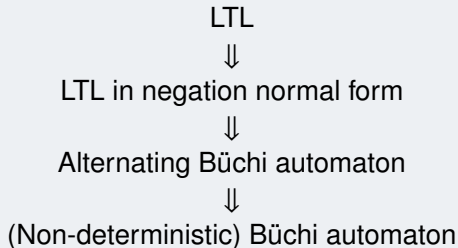
## Aim of the translation

Given an LTL formula, we want to translate an LTL formula to a Büchi automaton such that the language of the Büchi automaton is exactly the set of words satisfying the LTL formula.

Note that this is the last missing piece for a full model checking workflow!

## Approach presented in the following

We do a multi-step translation:



# LTL: Translation to NNF

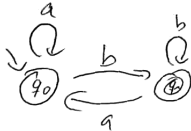
## Equivalences

We utilize some equivalences (for all LTL subformulas  $\psi$ ):

- $\neg \mathbf{F}\psi \equiv \mathbf{G}\neg\psi$
- $\neg \mathbf{G}\psi \equiv \mathbf{F}\neg\psi$
- $\neg \mathbf{X}\psi \equiv \mathbf{X}\neg\psi$
- $\neg(\psi \mathbf{U} \psi') \equiv \neg\psi \mathbf{R} \neg\psi'$
- $\neg(\psi \mathbf{R} \psi') \equiv \neg\psi \mathbf{U} \neg\psi'$
- $(\neg\neg\psi \equiv \psi)$

# Branching modes

Det. Aut



one word

ababba...

one run

$q_0 q_1 \dots$

$w \in \mathcal{L}(A)$  if  
the run  
accepts

Non-det. Aut.



one word

ababba...

Many runs

$q_0 q_0 q_1 q_0 \dots$

$q_0 q_0 q_0 q_0 \dots$

$w \in \mathcal{L}(A)$  if  
one run  
accepts

Universal aut.



one word

ababba...

Many runs

$q_0 q_0 q_0 q_0 \dots$

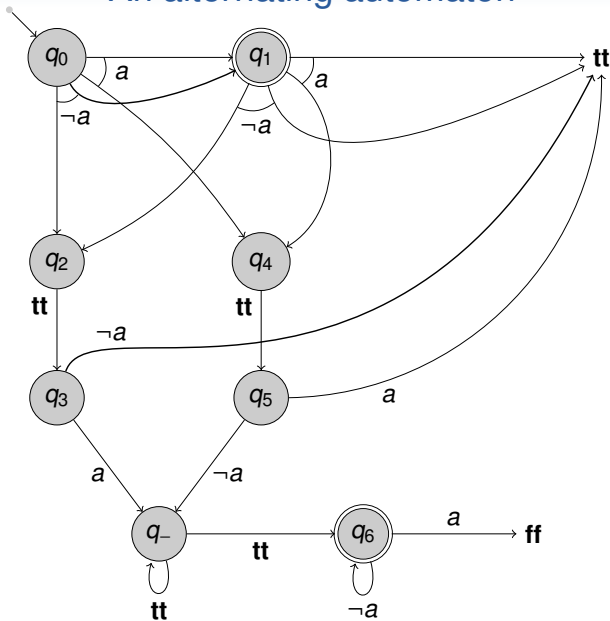
$q_0 q_1$

$q_0 q_0 q_0 q_1 \dots$

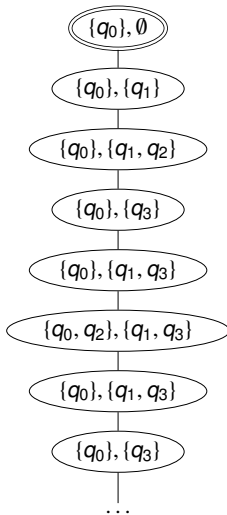
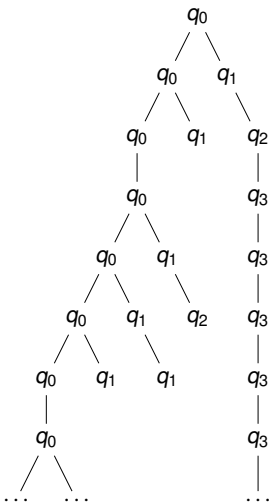
$w \in \mathcal{L}(A)$  if  
all infinite  
runs accept.



## An alternating automaton

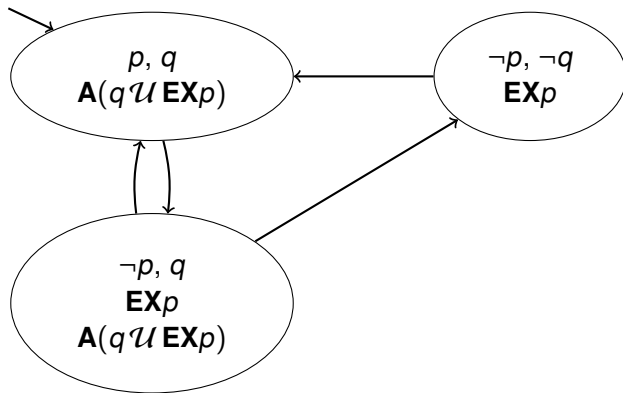


## The Miyano-Hayashi Construction



## CTL Example using a simple Kripke structure

CTL formula of interest:  $\mathbf{A}(q \mathcal{U} \mathbf{EX}p)$



## Labeling states with CTL subformulas (excerpt)

### **EF** $\psi$

Perform the following steps:

- Label every state satisfying  $\psi$  with **EF** $\psi$ .
- Label every state with a successor state labeled by **EF** $\psi$  by **EF** $\psi$  as well.
- Repeat the previous step until no more states can be labeled with **EF** $\psi$ .

### **AG** $\psi$

Let us use the fact that **AG** $\psi \equiv \mathbf{EF}\neg\psi$ . Using this fact, we can execute the following approach:

- Initially, label every state satisfying  $\psi$  with **AG** $\psi$ .
- Remove the **AG** $\psi$  label of every state with a successor state not labelled by **AG** $\psi$ .
- Repeat the previous step until no more state labels can be removed.

## Modal $\mu$ -calculus (short version!)

### Syntax

Modal  $\mu$ -calculus is an extension of propositional logic. For some given set of variable symbols  $\mathcal{V}$ , formulas in modal  $\mu$ -calculus over some set of variables with defined values  $V$  and some set of atomic proposition  $AP$  is defined as follows (for  $p \in AP$  and  $x \in \mathcal{V} \setminus V$ ):

$$\begin{aligned} \psi(V, AP) := & \top \mid \perp \mid p \mid x \mid \Box\psi(V, AP) \mid \Diamond\psi(V, AP) \\ & \mid \psi(V, AP) \cup \psi(V, AP) \mid \psi(V, AP) \cap \psi(V, AP) \\ & \mid \mu x. \psi(V \cup \{x\}, AP) \mid \nu x. \psi(V \cup \{x\}, AP) \end{aligned}$$

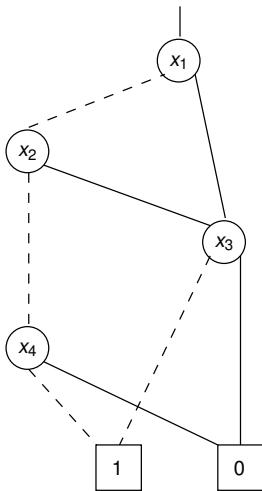
## A more thorough formalization of CTL operators

### Using fixed point equation

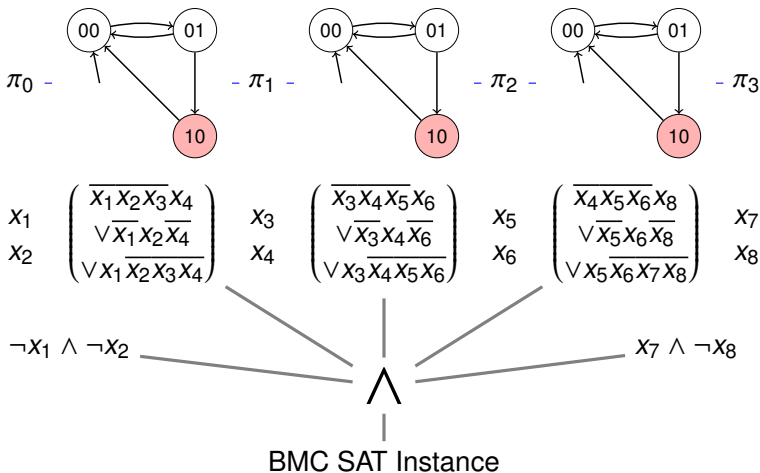
We can formalize these rules as follows:

<b>AX</b> $\psi$	$\Box\psi$
<b>EX</b> $\psi$	$\Diamond\psi$
<b>AG</b> $\psi$	$\nu X.\psi \cap \Box X$
<b>EG</b> $\psi$	$\nu X.\psi \cap \Diamond X$
<b>AF</b> $\psi$	$\mu X.\psi \cup \Box X$
<b>EF</b> $\psi$	$\mu X.\psi \cup \Diamond X$
<b>A</b> ( $\psi \mathcal{U} \psi'$ )	$\mu X.\psi' \cup (\psi \cap \Box X)$
<b>E</b> ( $\psi \mathcal{U} \psi'$ )	$\mu X.\psi' \cup (\psi \cap \Diamond X)$
<b>A</b> ( $\psi \mathbf{R} \psi'$ )	$\nu X.\psi' \cap (\psi \cup \Box X)$
<b>E</b> ( $\psi \mathbf{R} \psi'$ )	$\nu X.\psi' \cap (\psi \cup \Diamond X)$

# Reduced Ordered Binary Decision Diagrams



# SAT solving for bounded model checking



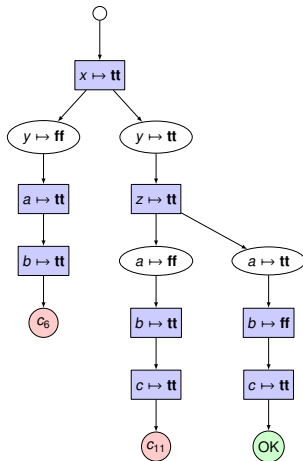


## A first example: Sudoku

1				7				
		9	3		8	2		
		2			9		8	
	8					4	5	2
			6					
		1					3	
	4			1		3	7	
		6	7			9		
	1							

# Unit propagation

$$\begin{aligned}
 \psi(x, y, z, a, b, c) = & \underbrace{x}_{c_1} \wedge \underbrace{(\neg x \vee y \vee z)}_{c_2} \wedge \underbrace{(\neg y \vee z)}_{c_3} \\
 & \wedge \underbrace{(y \vee a)}_{c_4} \wedge \underbrace{(y \vee b)}_{c_5} \wedge \underbrace{(\neg a \vee \neg b)}_{c_6} \\
 & \wedge \underbrace{(\neg y \vee a \vee b)}_{c_7} \wedge \underbrace{(\neg a \vee b \vee c)}_{c_8} \\
 & \wedge \underbrace{(a \vee b \vee \neg c)}_{c_9} \wedge \underbrace{(a \vee \neg b \vee c)}_{c_{10}} \\
 & \wedge \underbrace{(a \vee \neg b \vee \neg c)}_{c_{11}}
 \end{aligned}$$



## The complete DPLL algorithm

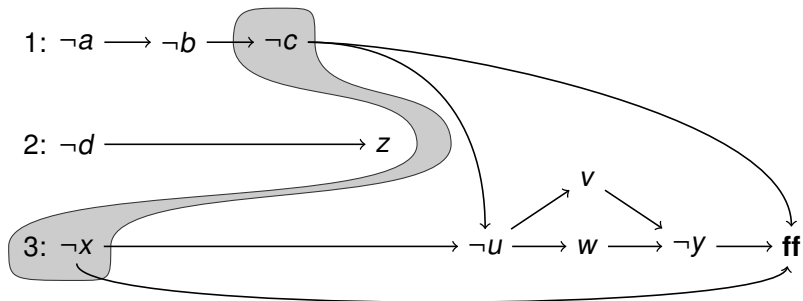
**Algorithm 2** The complete DPLL algorithm with *unit propagation* and with the *pure literal rule*. The parameter  $\mathcal{V}$  represents the set of variables,  $\psi$  is the CNF formula, and  $A : \mathcal{V} \rightarrow \mathbb{B}$  is the current partial assignment.

---

```
1: function SEARCH( $\mathcal{V}, \psi, A$ )
2:   for all assignments  $v_k = b_k$  implied by  $(\psi, A)$  by unit propagation do
3:      $A := A \cup \{v_k \mapsto b_k\}$ 
4:   end for
5:   for all assignments  $v_k = b_k$  implied by  $(\psi, A)$  by pure literal elimination do
6:      $A := A \cup \{v_k \mapsto b_k\}$ 
7:   end for
8:   if some clause in  $\psi$  is falsified by  $A$  then
9:     return  $\emptyset$ 
10:  end if
11:  if  $|A| = |\mathcal{V}|$  then
12:    return  $A$ 
13:  end if
14:  Pick a variable  $v$  that is not yet in the domain of  $A$ 
15:   $A' \leftarrow \text{SEARCH}(\mathcal{V}, \psi, A \cup \{v \mapsto \text{false}\})$ 
16:  if  $A' \neq \emptyset$  then return  $A'$ 
17:   $A' \leftarrow \text{SEARCH}(\mathcal{V}, \psi, A \cup \{v \mapsto \text{true}\})$ 
18:  if  $A' \neq \emptyset$  then return  $A'$ 
19:  return  $\emptyset$ 
20: end function
```

---

## A cut through an implication graph



# DPLL+Clause learning = CDCL

## Core techniques in CDCL solvers

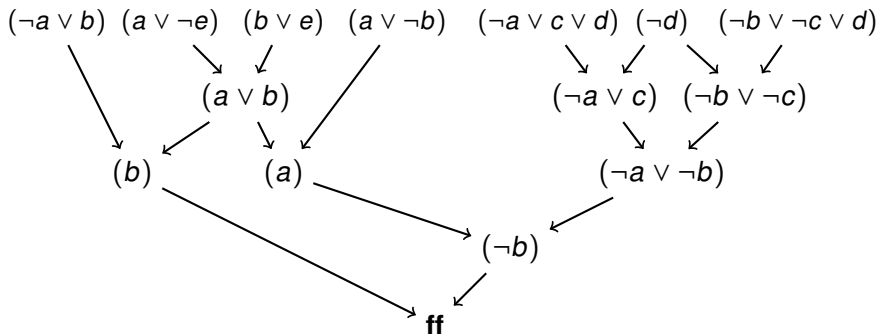
- Backtracking
- Unit propagation
- Pure literal elimination
- Conflict-driven clause learning

Main publications for CDCL were made between 1997 and 2004.<sup>a</sup>

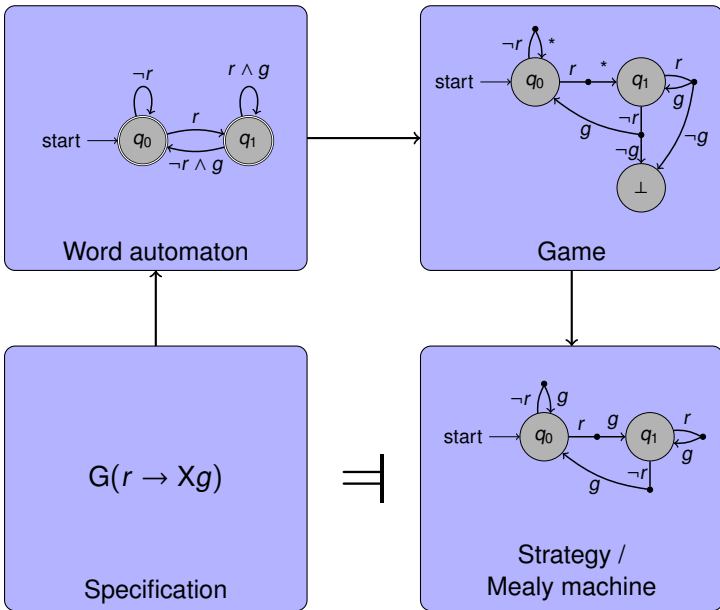
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<sup>a</sup>Handbook of Satisfiability, page 119, first paragraph of Section 3.6.3.3

## Analyzing the Pidgeon Hole Principle SAT instances (3)



# General synthesis workflow



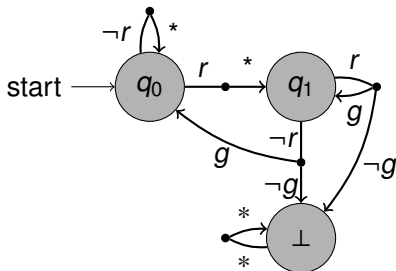
# Games

## Definition

Every player in a (two-player) game  $\mathcal{G} = (V_0, V_1, \Sigma_0, \Sigma_1, E_0, E_1, v_0, \mathcal{F})$  has:

- Positions
- Actions
- Transitions
- A goal

Additionally, there is some initial position.



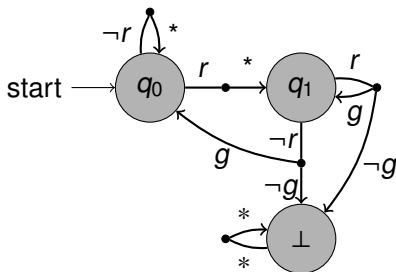


# Games for synthesis

## Strategies

One player is the **system player**, whereas the other player is the **environment player**.

If player  $p \in \{0, 1\}$  has a **strategy** to win, then she can enforce to win by playing the strategy. We say that player  $p$  **wins the game** in such a case.

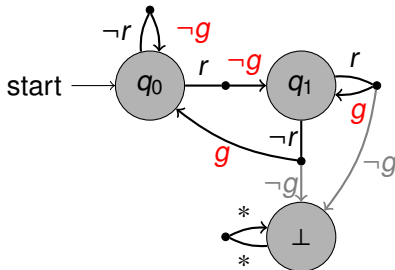


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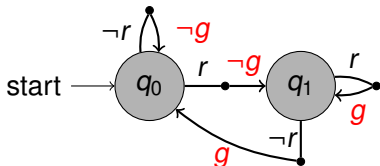


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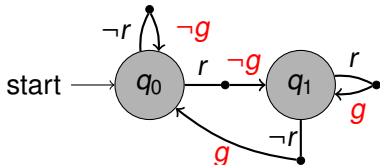
This is a Mealy Machine!

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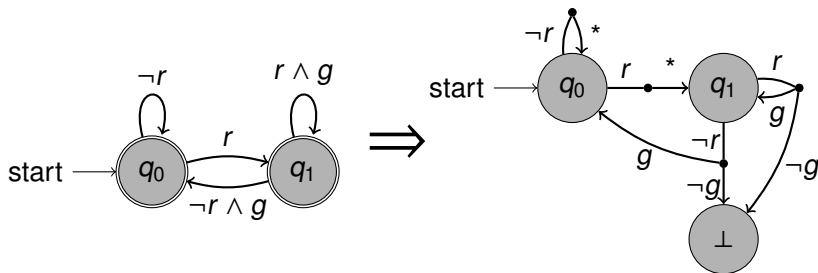


This is a Mealy Machine!

## Strategies in synthesis games

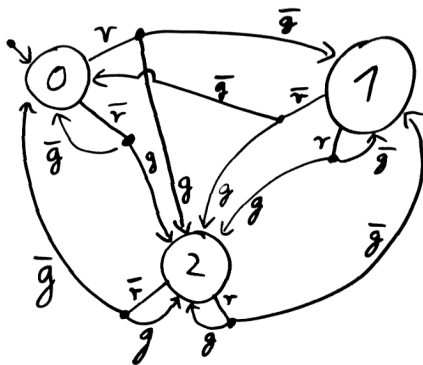
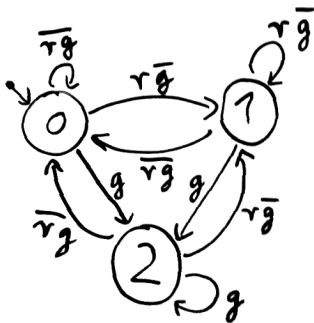
In games that correspond to a specification, winning strategies for the system player represent Mealy (or Moore) machines that satisfy the specification.

# Building safety games from deterministic safety automata

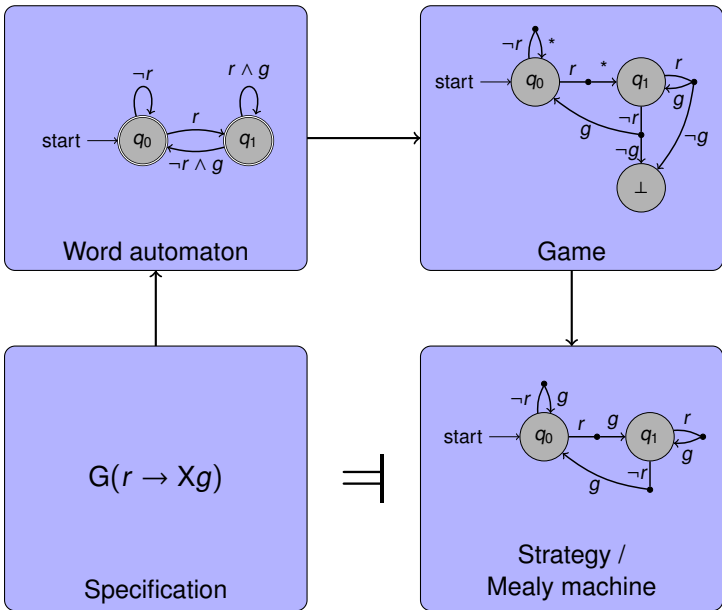


# Parity automata and games

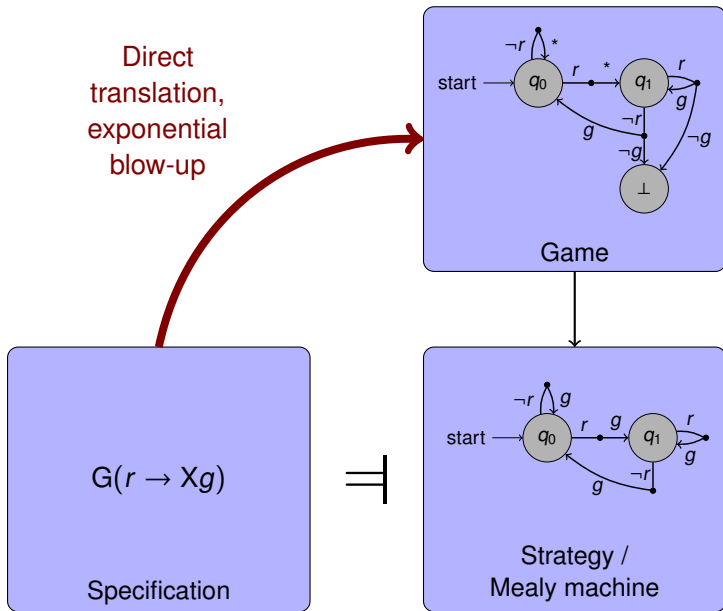
$$GF r \rightarrow GF g$$



# GR(1) Synthesis (Bloem et al., 2012) – Main idea (2)

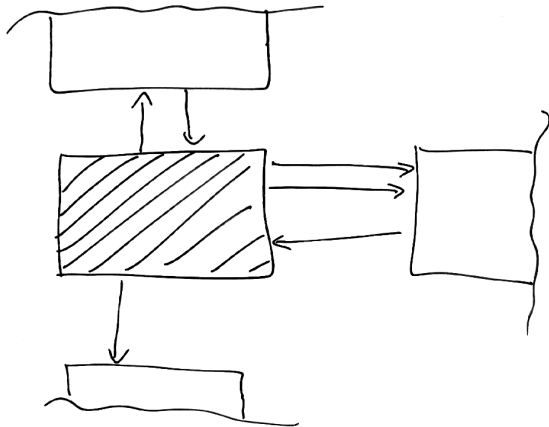


## GR(1) Synthesis (Bloem et al., 2012) – Main idea (2)





## Assumptions and guarantees in specifications



Specification shape

$$(\bigwedge \text{Assumptions}) \rightarrow (\bigwedge \text{Guarantees})$$

## Building the game

### Relevant specification parts for building the game

- Safety **assumptions**:  $\mathbf{G}(\neg x \vee \neg \mathbf{X} x)$
- Safety **guarantees**:  $\mathbf{G}((\neg x \wedge y) \rightarrow \mathbf{X} x)$

### Game

$\bar{x}y$

$xy$

$\overline{xy}$

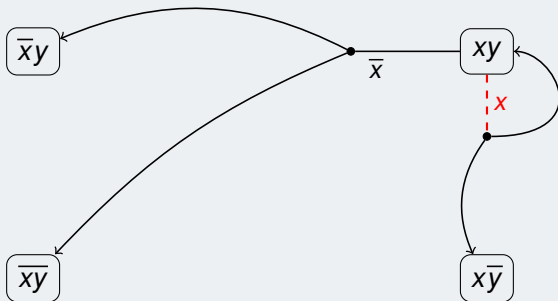
$x\bar{y}$

## Building the game

### Relevant specification parts for building the game

- Safety **assumptions**:  $\mathbf{G}(\neg x \vee \neg \mathbf{X} x)$
- Safety **guarantees**:  $\mathbf{G}((\neg x \wedge y) \rightarrow \mathbf{X} x)$

### Game





## The final GR(1) fixpoint

$$\nu Z. \bigcap_{j \in \{1, \dots, n\}} \mu Y. \bigcup_{i \in \{1, \dots, m\}} \nu X. \text{EnfPre}\left((Z' \cap \psi_j^g) \cup Y' \cup (\neg \psi_i^a \cap X')\right)$$

## The final GR(1) fixpoint

$$\nu Z. \bigcap_{j \in \{1, \dots, n\}} \mu Y. \bigcup_{i \in \{1, \dots, m\}} \nu X. \text{EnfPre}((Z' \cap \psi_j^g) \cup Y' \cup (\neg \psi_i^a \cap X'))$$

Reaching the next system goal

## The final GR(1) fixpoint

$$\nu Z. \bigcap_{j \in \{1, \dots, n\}} \mu Y. \bigcup_{i \in \{1, \dots, m\}} \nu X. \text{EnfPre}((Z' \cap \psi_j^g) \cup Y' \cup (\neg \psi_i^a \cap X'))$$

Reaching the next system goal

Getting closer to the next system goal

## The final GR(1) fixpoint

$$\nu Z. \bigcap_{j \in \{1, \dots, n\}} \mu Y. \bigcup_{i \in \{1, \dots, m\}} \nu X. \text{EnfPre}((Z' \cap \psi_j^g) \cup Y' \cup (\neg \psi_i^a \cap X'))$$

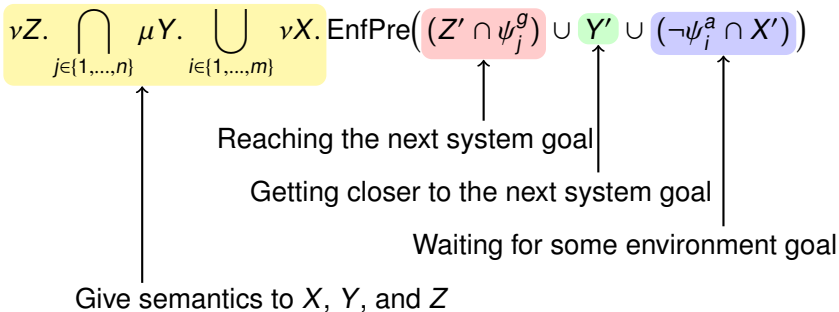
Reaching the next system goal

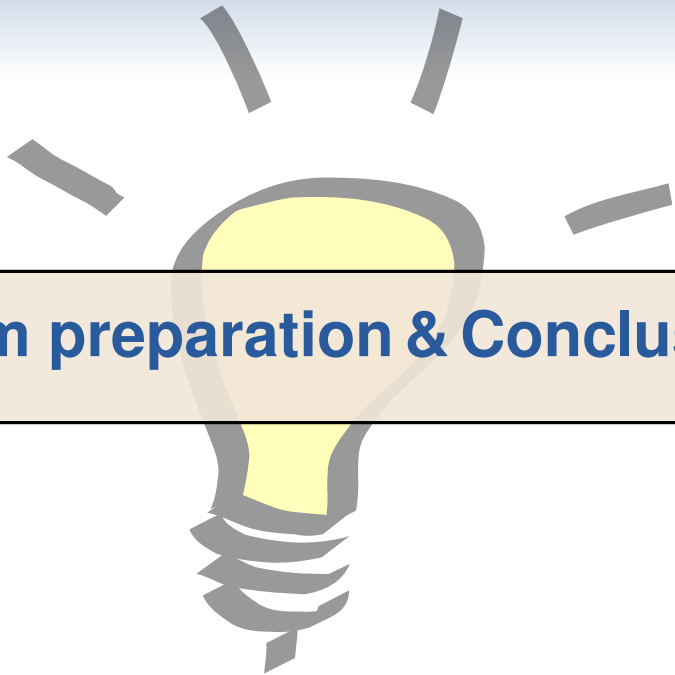
Getting closer to the next system goal

Waiting for some environment goal



## The final GR(1) fixpoint





# **Exam preparation & Conclusion**

## Some hints on typical oral exam questions

### **SOME** answers that you should be able to give

- What was the course about? What were the main questions? Why did we deal with “Model Checking and Games” at all?
- What were the main topics of the course?
- For each of the main topics:
  - Why did we deal with them?
  - What were the main ideas?
  - How can the main ideas be applied to verify actual systems?
  - What were the main constructions/main algorithms/main ideas?
  - What were the main ideas of the algorithms/constructions?
  - Demonstrate that you know roughly how the constructions/algorithms work.



Thanks for  
participating  
in this  
course!

# Appointments

If you want to discuss some lecture material as part of your exam preparation, you can book an appointment for the lecturer's office hours at:

<https://appointments.ruediger-ehlers.de>

# References I

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