# Controlling information in probabilistic systems The case of fault diagnosis

PhD defence of Engel Lefaucheux

Supervisors: Nathalie Bertrand and Serge Haddad

Septembre 24th 2018 - IRISA/LSV/Inria Rennes







## Information disclosure

### Systems give information





## Information disclosure

#### Systems give information





• Disclose useful information to the user

#### Systems give information





- Disclose useful information to the user
- Disclose secret information to an attacker

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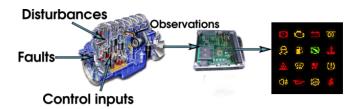
Analysing and controlling the revealed information is crucial

# Fault diagnosis

Detecting faulty behaviours

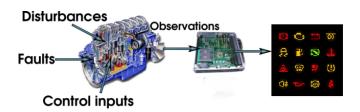
# Fault diagnosis

## Detecting faulty behaviours



# Fault diagnosis

Detecting faulty behaviours



Diagnoser: must emit a verdict when faults occur, based on observations

# Features of a diagnoser

Verdict: information provided

Correctness: accuracy of the verdict

Reactivity: delay before a verdict is given

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Diagnosability: does there exist a diagnoser?

Synthesis: how to build a diagnoser?

# Why diagnosis?

Faults and/or failures are unavoidable for some systems

- Components have a finite lifetime
- Reactive systems suffer from unpredictable behaviours of the environment





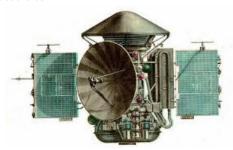
# Why diagnosis?

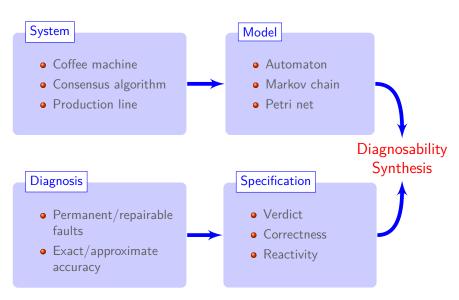
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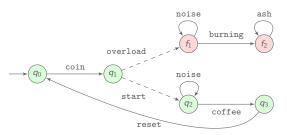
Consequences of unhandled faults may be critical

- Financial losses
- Human casualties

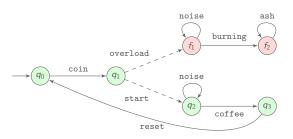






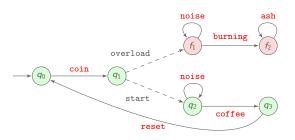






#### Partial observation



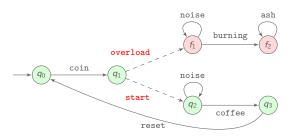


#### Partial observation

Observable events

\_

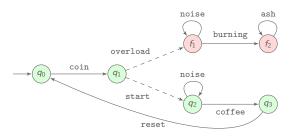




#### Partial observation

Observable events/unobservable events



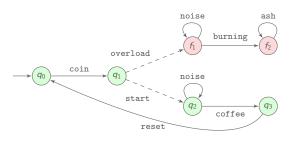


#### Partial observation

Observable events/unobservable events

Run:  $q_0 \xrightarrow{\text{coin}} q_1 \xrightarrow{\text{start}} q_2 \xrightarrow{\text{noise}} q_2 \mid Observation: coin noise}$ 





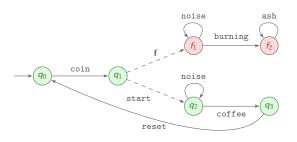
#### Partial observation

Observable events/unobservable events

Run:  $q_0 \xrightarrow{\mathtt{coin}} q_1 \xrightarrow{\mathtt{start}} q_2 \xrightarrow{\mathtt{noise}} q_2 \mid \textit{Observation:} \mathtt{coin} \; \mathtt{noise}$ 

One special event: A run is faulty iff the fault f occurs



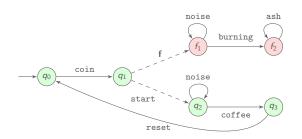


#### Partial observation

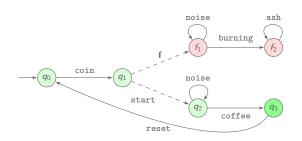
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One special event: A run is faulty iff the fault **f** occurs

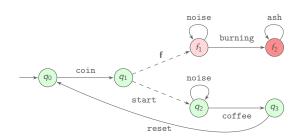


Observation  $\longrightarrow$  Set of potential states of the system



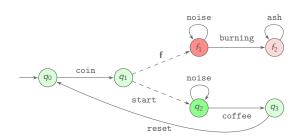
Observation  $\longrightarrow$  Set of potential states of the system

$$\texttt{Obs}^{-1}(\texttt{coin coffee}) = \{q_0 \xrightarrow{\texttt{coin}} q_1 \xrightarrow{\texttt{start}} q_2 \xrightarrow{\texttt{coffee}} q_3\}$$



Observation  $\longrightarrow$  Set of potential states of the system

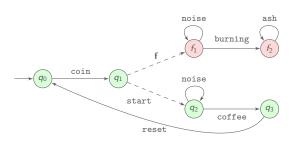
$$\mathtt{Obs}^{-1}(\mathtt{coin}\ \mathtt{burning}) = \{q_0 \xrightarrow{\mathtt{coin}} q_1 \xrightarrow{\mathtt{f}} f_1 \xrightarrow{\mathtt{burning}} f_2\}$$



Observation  $\longrightarrow$  Set of potential states of the system

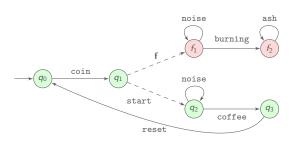
```
✓ coin coffee surely correct
X coin burning surely faulty
? coin noise ambiguous
```

$$\texttt{Obs}^{-1}(\texttt{coin noise}) = \{q_0 \xrightarrow{\texttt{coin}} q_1 \xrightarrow{\texttt{start}} q_2 \xrightarrow{\texttt{noise}} q_2, q_0 \xrightarrow{\texttt{coin}} q_1 \xrightarrow{\texttt{f}} f_1 \xrightarrow{\texttt{noise}} f_1\}$$



- Verdict: detection of faults
- Correctness: if a fault is claimed, a fault occurred
- Reactivity: every fault will be detected after a bounded delay

[SSLST96] Sampath, Sengupta, Lafortune, Sinnamohideen and Teneketzis, Failure diagnosis using discrete-event models, IEEE TCST, 1996.



- Verdict: detection of faults
- Correctness: if a fault is claimed, a fault occurred
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Correct but not reactive diagnoser: claiming a fault when burning occurs

[SSLST96] Sampath, Sengupta, Lafortune, Sinnamohideen and Teneketzis, Failure diagnosis using discrete-event models, IEEE TCST, 1996.

#### Useful to model some systems

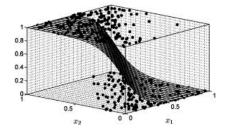


Internal random behaviour

### Useful to model some systems



Internal random behaviour

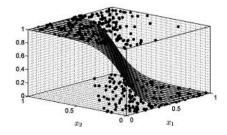


Models through statistical analysis

#### Useful to model some systems



Internal random behaviour



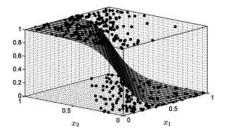
Models through statistical analysis

## **Enable quantitative requirements**

## Useful to model some systems



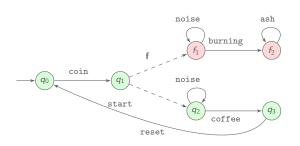
Internal random behaviour



Models through statistical analysis

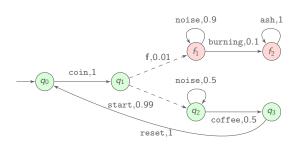
#### **Enable quantitative requirements**

- Is the system diagnosable, ignoring negligible behaviours?
- What is the measure of undetected faults?
- What is the average delay of fault detection?



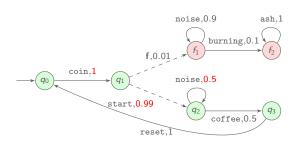
## Probability of a run

$$\textit{Run } \rho = q_0 \xrightarrow[]{\texttt{coin}} q_1 \xrightarrow[]{\texttt{start}} q_2 \xrightarrow[]{\texttt{noise}} q_2$$



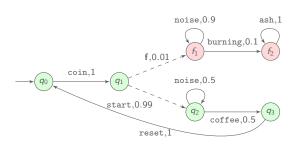
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## Probability of a run

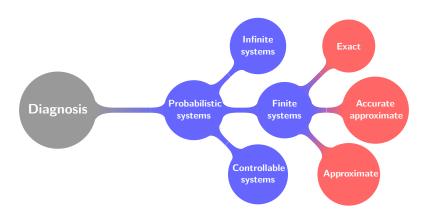
 $\textit{Run } \rho = \textit{q}_0 \xrightarrow{\texttt{coin}} \textit{q}_1 \xrightarrow{\texttt{start}} \textit{q}_2 \xrightarrow{\texttt{noise}} \textit{q}_2 \mid \textit{Probability } \mathbb{P}(\rho) = 1 \times 0.99 \times 0.5$ 



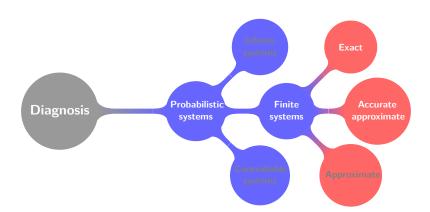
Probability of a run 
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ightarrow Defines a probability measure on the set of infinite runs

# Contributions on the diagnosis of probabilistic systems



# Contributions on the diagnosis of probabilistic systems



### Stochastic model

• Finite Markov chain

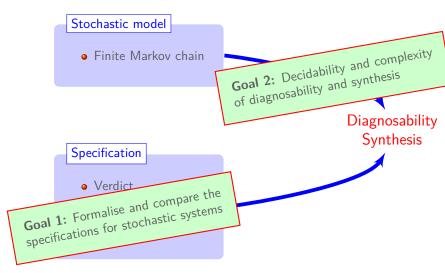
### Specification

- Verdict
- Correctness
- Reactivity

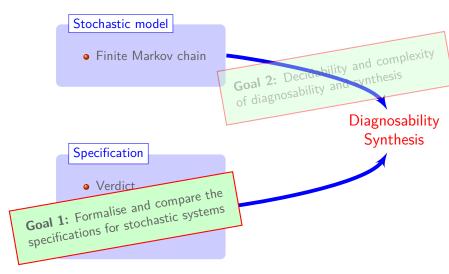
Diagnosability Synthesis

# Challenges

# Stochastic model Finite Markov chain Diagnosability **Synthesis** Specification Verdict Goal 1: Formalise and compare the specifications for stochastic systems

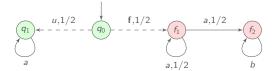


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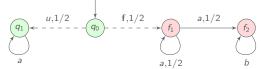
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#### Verdict: information provided



Correctness: accuracy of the verdict

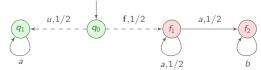
#### Verdict: information provided



 $a^n$  is ambiguous

### Correctness: accuracy of the verdict

#### Verdict: information provided



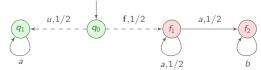
a<sup>n</sup> is ambiguous

Faults are detected almost surely:

$$\lim_{n\to\infty} \mathbb{P}(\{q_0 \xrightarrow{\mathsf{f}} f_1(\xrightarrow{\mathsf{a}} f_1)^n, q_0 \xrightarrow{\mathsf{f}} (f_1 \xrightarrow{\mathsf{a}})^n f_2\}) = 0$$

### Correctness: accuracy of the verdict

#### Verdict: information provided



a<sup>n</sup> is ambiguous

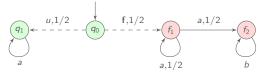
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Correct runs stay ambiguous: 
$$\lim_{n\to\infty} \mathbb{P}(\{q_0 \xrightarrow{u} q_1(\xrightarrow{a} q_1)^n\}) = \frac{1}{2}$$

### Correctness: accuracy of the verdict

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Faulty runs or all ambiguous runs?

### Correctness: accuracy of the verdict

#### Verdict: information provided

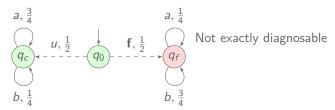
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#### Correctness: accuracy of the verdict

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Faulty runs or all ambiguous runs?

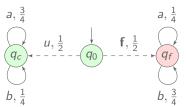
### Correctness: accuracy of the verdict



#### Verdict: information provided

Faulty runs or all ambiguous runs?

#### Correctness: accuracy of the verdict



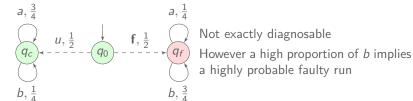
Not exactly diagnosable

However a high proportion of b implies a highly probable faulty run

#### Verdict: information provided

Faulty runs or all ambiguous runs?

#### Correctness: accuracy of the verdict



Exact, approximate or accurate approximate?

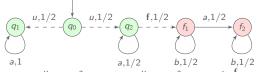
#### Verdict: information provided

Faulty runs or all ambiguous runs?

#### Correctness: accuracy of the verdict

Exact, approximate or accurate approximate?

#### Reactivity: delay before a verdict is given



 $a^n \text{ is ambiguous: } q_0 \overset{a,1}{\to} q_1 (\overset{a}{\to} q_1)^n, q_0 \overset{u}{\to} q_2 (\overset{b,1/2}{\to} q_2)^{n-1} \overset{b,1/2}{\overset{f}{\to}} f_1 \overset{a}{\to} f_2$ 

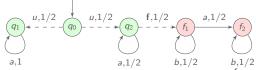
#### Verdict: information provided

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 $\begin{array}{c} \mathbf{a},\mathbf{1} & \mathbf{a},1/2 & \mathbf{b},1/2 \\ \mathbf{a}^n \text{ is ambiguous: } q_0 \overset{u}{\to} q_1 (\overset{a}{\to} q_1)^n, q_0 \overset{u}{\to} q_2 (\overset{a}{\to} q_2)^{n-1} \overset{\mathbf{f}}{\to} f_1 \overset{a}{\to} f_2 \\ \mathbf{a}^n \text{ is likely to be observed } \mathbb{P}(\mathbf{a}^n) = \frac{1}{2} + \frac{1}{2^n} + \frac{1}{2^{n-1}} \end{array}$ 

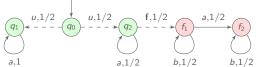
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 $a^n \text{ is ambiguous: } q_0 \overset{a,1}{\rightarrow} q_1 (\overset{a}{\rightarrow} q_1)^n, q_0 \overset{u}{\rightarrow} q_2 (\overset{b,1/2}{\rightarrow} q_2)^{n-1} \overset{b,1/2}{\rightarrow} f_1 \overset{a}{\rightarrow} f_2$   $a^n \text{ is likely to be observed } \mathbb{P}(a^n) = \frac{1}{2} + \frac{1}{2^n} + \frac{1}{2^{n-1}}$ 

However,  $a^{\omega}$  is surely correct:  $q_0 \stackrel{u}{\rightarrow} q_1 (\stackrel{a}{\rightarrow} q_1)^{\omega}, q_0 \stackrel{u}{\rightarrow} q_2 (\stackrel{a}{\rightarrow} q_2)^{\omega}$ 

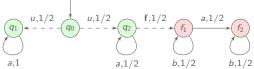
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Almost sure, uniform almost sure or infinite?

#### Verdict: information provided

Faulty runs or all ambiguous runs?

#### Correctness: accuracy of the verdict

Exact, approximate or accurate approximate?

#### Reactivity: delay before a verdict is given

Almost sure, uniform almost sure or infinite?

Each combination of features defines a diagnoser notion

#### Verdict: information provided

Faulty runs or all ambiguous runs?

#### Correctness: accuracy of the verdict

Exact, approximate or accurate approximate?

#### Reactivity: delay before a verdict is given

Almost sure, uniform almost sure or infinite?

Each combination of features defines a diagnoser notion

 $\rightarrow$  Semantical analysis of the relations

Verdict: Detection of faulty runs

Reactivity: Finite delay

Verdict: Detection of faulty runs

Reactivity: Finite delay

Reactivity Correctness	Uniform almost sure	Almost sure
Exact	Uniform FF-diagnosability	FF-diagnosability
		$\lim_{n\to\infty} \mathbb{P}(FAmb_n) = 0$
Accurate approximate	Uniform AFF-diagnosability	AFF-diagnosability
		$\forall \varepsilon > 0, \lim_{n \to \infty} \mathbb{P}(\mathit{FAmb}_n^{\varepsilon}) = 0$
Approximate	Uniform $arepsilon$ FF-diagnosability	arepsilonFF-diagnosability

Verdict: Detection of faulty runs

Reactivity: Finite delay

Reactivity Correctness	Uniform almost sure	Almost sure
Exact	Uniform FF-diagnosability [TT05][BHL18]	FF-diagnosability [BHL14][BHL18] $\lim_{n\to\infty} \mathbb{P}(FAmb_n) = 0$
Accurate approximate	Uniform AFF-diagnosability [TT05][BHL16][BHL18]	AFF-diagnosability [BHL16] [BHL18] $\forall \varepsilon > 0, \lim_{n \to \infty} \mathbb{P}(FAmb_n^{\varepsilon}) = 0$
Approximate	Uniform εFF-diagnosability [BHL16][BHL18]	εFF-diagnosability [BHL16][BHL18]

[TT05] Thorsley and Teneketzis, Diagnosability of stochastic discrete-event systems, IEEE TAC, 2005.

[BHL14] Bertrand, Haddad and Lefaucheux, Foundation of diagnosis and predictability in probabilistic systems, FSTTCS, 2014.

[BHL16] Bertrand, Haddad and Lefaucheux, Accurate approximate diagnosability of stochastic systems, LATA, 2016.

[BHL18] Bertrand, Haddad and Lefaucheux, A Tale of Two Diagnoses in Probabilistic Systems, I&C, 2018.

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Verdict: Detection of faulty runs

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Reactivity Correctness	Uniform almost sure	Almost sure
Exact	Uniform FF-diagnosability ← [TT05][BHL18]	FF-diagnosability [BHL14][BHL18] $\lim_{n\to\infty} \mathbb{P}(FAmb_n) = 0$
	<b>I</b>	₩
Accurate approximate	Uniform AFF-diagnosability = [TT05][BHL16][BHL18]	AFF-diagnosability [BHL16][BHL18] $\forall \varepsilon > 0, \lim_{n \to \infty} \mathbb{P}(FAmb_{\varepsilon}^{\varepsilon}) = 0$
	₩	<b>1</b>
Approximate	Uniform εFF-diagnosability= [BHL16][BHL18]	⇒ εFF-diagnosability [BHL16][BHL18]

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Verdict: Detection of faulty runs

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Reactivity Correctness	Uniform almost sure	Almost sure
Exact	Uniform FF-diagnosability ← [TT05][BHL18]	$\Rightarrow FF\text{-diagnosability}$ $[BHL14][BHL18]$ $\lim_{n\to\infty} \mathbb{P}(FAmb_n) = 0$
Accurate approximate	Uniform AFF-diagnosability =  [TT05][BHL16][BHL18]	<b>+</b>
Approximate	↓↓ Uniform εFF-diagnosability= [BHL16][BHL18]	$\forall \varepsilon > 0$ , $\lim_{n \to \infty} \mathbb{P}(FAmb_n^{\varepsilon}) = 0$ $\Rightarrow \varepsilon FF-diagnosability$ [BHL16][BHL18]

[TT05] Thorsley and Teneketzis, Diagnosability of stochastic discrete-event systems, IEEE TAC, 2005.

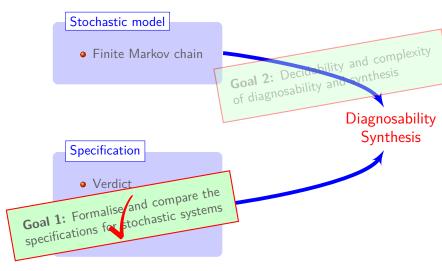
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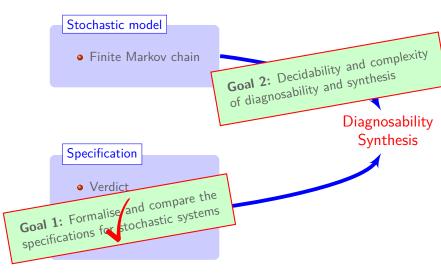
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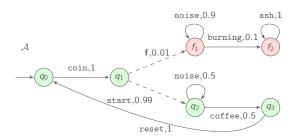




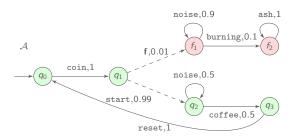
# FF-diagnosability

#### Definition

The probability of faulty ambiguous runs converges to 0

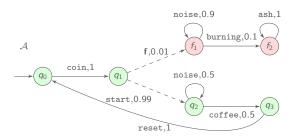


Faulty ambiguous runs: ending with  $(f_1 \xrightarrow{noise} f_1)^*$ 



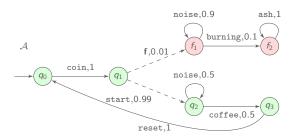
 $\mathcal{O}_{\mathcal{A}}$ : sequence of observations  $\mapsto$  set of possible current states

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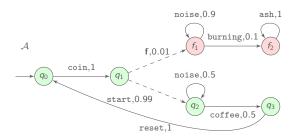
 $\mathcal{O}_{\mathcal{A}}$ 

 $\longrightarrow$   $\{q_0\}$ 



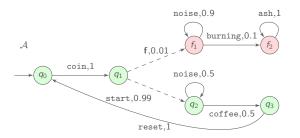


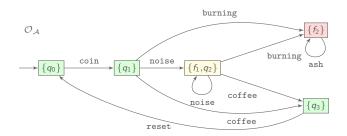




 $\mathcal{O}_{\mathcal{A}}$ 

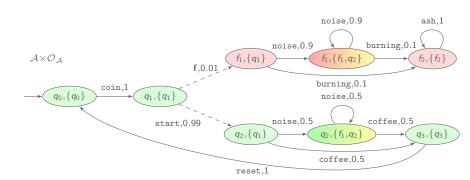




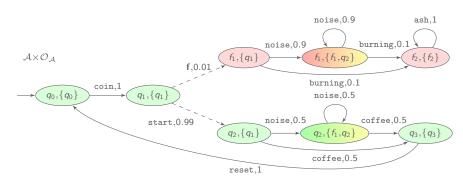


PhD defence

# Synchronised product

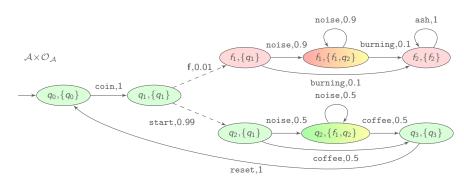


# Synchronised product



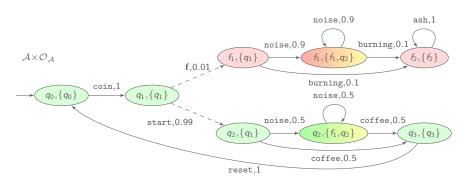
ullet Same stochastic behaviour as  ${\cal A}$ 

# Synchronised product



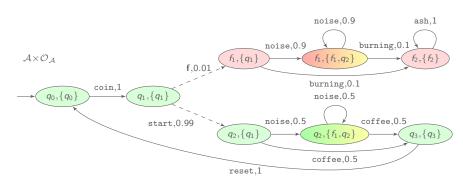
- Same stochastic behaviour as A
- Ambiguity of a run deduced from its last state

# Synchronised product



- ullet Same stochastic behaviour as  ${\cal A}$
- Ambiguity of a run deduced from its last state
- ullet Possibly exponential in the size of  ${\mathcal A}$

# Synchronised product



- ullet Same stochastic behaviour as  ${\cal A}$
- Ambiguity of a run deduced from its last state
- ullet Possibly exponential in the size of  ${\mathcal A}$

# FF-diagnosable iff no BSCC contains a faulty ambiguous state

### Complexity of FF-diagnosability

Verdict: Detection of faulty runs

Reactivity: Finite delay

Reactivity Correctness	Uniform almost sure	Almost sure
Exact	Uniform FF-diagnosability [TT05] [BHL18]	FF-diagnosability PSPACE-complete [BHL14][BHL18]
Accurate approximate	Uniform AFF-diagnosability [TT05][BHL16][BHL18]	AFF-diagnosability [BHL16][BHL18]
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[TT05] Thorsley and Teneketzis, Diagnosability of stochastic discrete-event systems, IEEE TAC, 2005.

[BHL14] Bertrand, Haddad and Lefaucheux, Foundation of diagnosis and predictability in probabilistic systems, FSTTCS, 2014.

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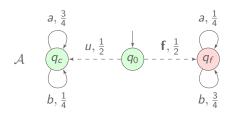
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# AFF-diagnosability

#### Definition

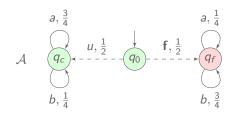
Faults are almost surely detected with arbitrarily small probability of false positive



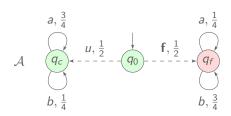
$$\mathbb{P}(\text{correct} \mid bba) = \frac{1}{4}$$

$$\mathbb{P}(\text{correct} \mid bbab) = \frac{1}{10}$$

High proportion of  $b \Rightarrow$  small probability of being correct

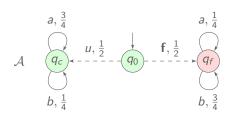


Distance between  $q_c$  and  $q_f$ :  $\sup_{E\subseteq \{a,b\}^\omega} \mathbb{P}_{q_f}(E) - \mathbb{P}_{q_c}(E)$ .



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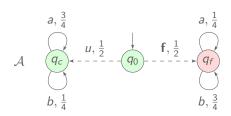
 $E = \{ \text{infinite words with proportion of } b \text{ greater than half} \}$ 



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E separates  $q_c$  and  $q_f$ :  $\mathbb{P}_{q_c}(E)=0$  and  $\mathbb{P}_{q_f}(E)=1$ 

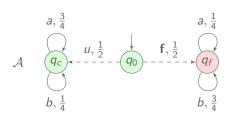


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 $\longrightarrow$  The distance between  $q_c$  and  $q_f$  is 1



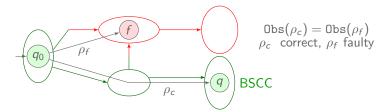
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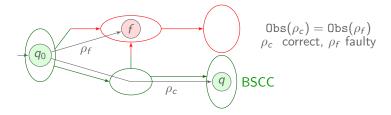
E separates  $q_c$  and  $q_f\colon \mathbb{P}_{q_c}(E)=0$  and  $\mathbb{P}_{q_f}(E)=1$ 

- $\longrightarrow$  The distance between  $q_c$  and  $q_f$  is 1
- $\longrightarrow \mathcal{A}$  is AFF-diagnosable

• Identifying relevant pairs of states

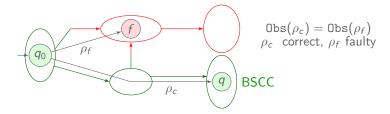


• Identifying relevant pairs of states



• Checking distance 1 for all relevant pairs

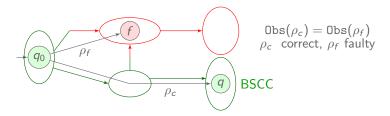
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AFF-diagnosable iff distance 1 for all relevant pairs

• Identifying relevant pairs of states



• Checking distance 1 for all relevant pairs

#### AFF-diagnosable iff distance 1 for all relevant pairs

• The distance 1 problem is in PTIME [CK14]

[CK14] Chen and Kiefer, On the Total Variation Distance of Labelled Markov Chains, CSL-LICS, 2014.

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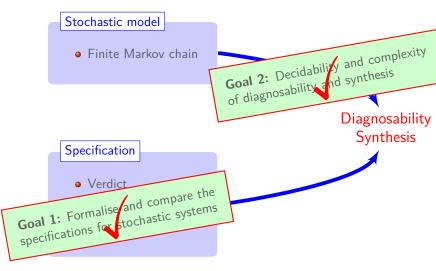
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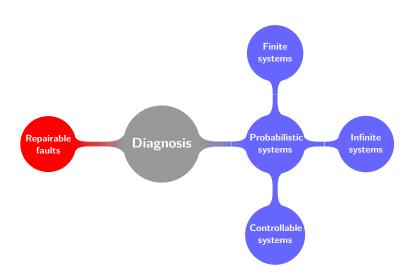
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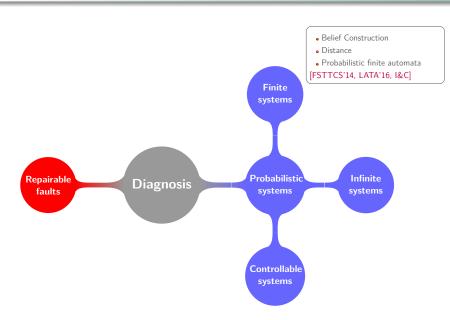
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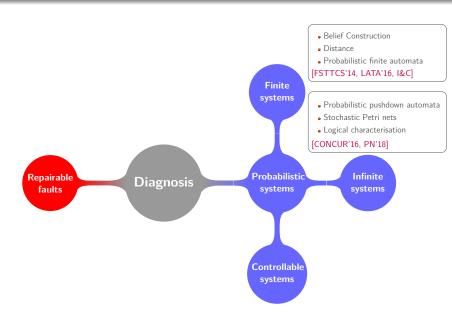


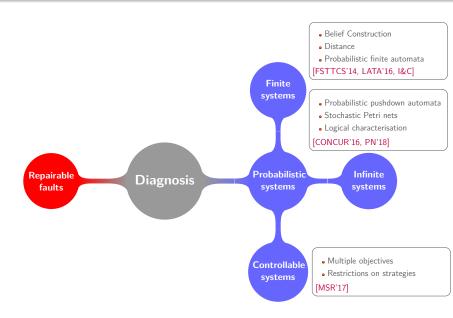
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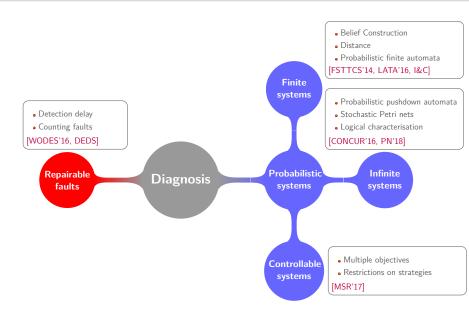


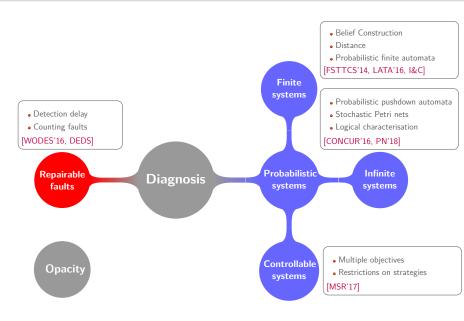
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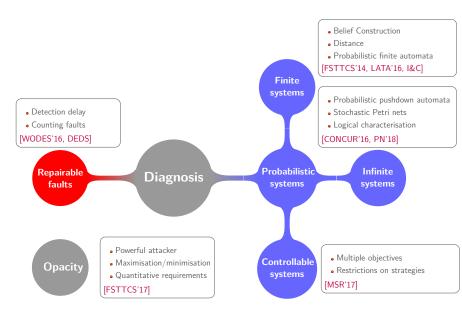


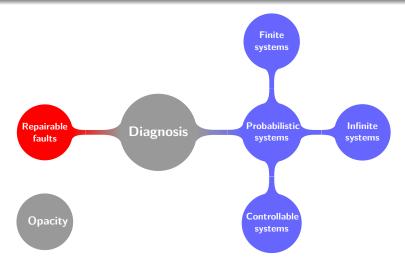


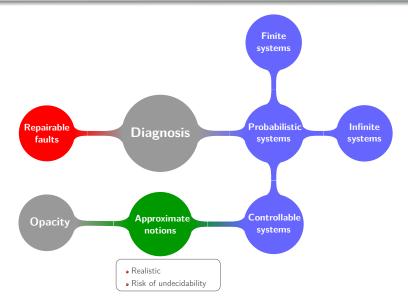


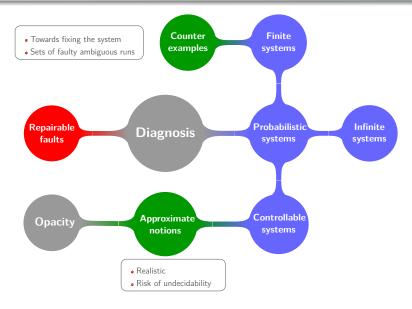


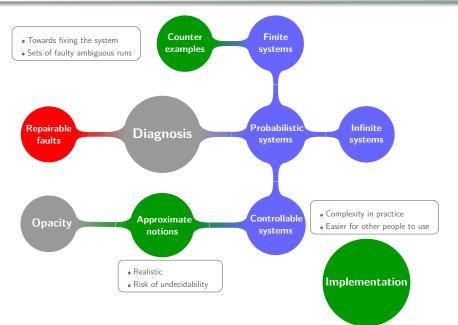
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