

# Exhaustive Diagnosis of Discrete Event Systems through Exploration of the Hypothesis Space

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# Outline

- 1 Definition
- 2 Motivation of this Work
- 3 Diagnosis Tests
- 4 Exploration Strategies
- 5 Evaluation

# A Definition of the Diagnosis Problem

## Input

- Model  $D$
- Observation  $o$
- Hypothesis space  $\mathcal{H}$

## Diagnosis

$$\Delta \stackrel{\text{def}}{=} \{\delta \in \mathcal{H} \mid D, o, \delta \not\models \perp\}$$

## Preferred Diagnosis

Preference relation over hypotheses:  $h \preceq h'$

Preferred diagnosis:

$$\Delta_{\preceq} \stackrel{\text{def}}{=} \min_{\preceq}(\Delta)$$

# (Model-Based) Diagnosis Approaches

## “Brute force” Approaches

Two steps:

- Compute all possible system behaviours
- Extract the diagnosis information from these behaviours

Darwiche et al, Lamperti & Zanella, Cordier et al.

## Test Approaches

Two steps:

- Test consistency of some propositions ( $D, o, Prop_i \{ \neq \perp \}^?$ )
- Deduce the diagnosis (or test more)

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## This Paper

→ exhaustive diagnosis of DES with test approaches

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# “Exotic” Hypothesis Spaces

## Set Hypothesis Space (classical definition)

A hypothesis is defined a set of faulty components.

## Multi set hypothesis space

A hypothesis records the number of occurrences of each fault.

## Sequence hypothesis space

A hypothesis records the order in which the faults occur.

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## Question

How does the test approach cop with such hypothesis spaces?

# Remarks

## Assumption

$\langle \mathcal{H}, \preceq \rangle$  is a partially ordered set

## Vocabulary

$h \preceq h'$ :

- $h'$  is a descendant of  $h$
- $h$  is an ancestor of  $h'$

$h \prec h' \wedge \forall h'' \in \mathcal{H}, h \preceq h'' \prec h' \Rightarrow h'' = h$

- $h'$  is a child of  $h$
- $h$  is a parent of  $h'$

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# Test

## Informally

Is there a diagnosis candidate in the specified set  $S$ ?

## Formally

Given a set  $S \subseteq \mathcal{H}$  of hypotheses, does  $S$  intersect  $\Delta$ ?

$$D, o, S \stackrel{?}{\neq} \perp$$

If so, return one such candidate  $\delta \in S \cap \Delta$

# Examples of Tests (1/2)

## Candidacy of Hypothesis $h$

“Is  $h$  a candidate?”

$$S_{cand}(h) = \{h\}$$

## Completeness of $D \subseteq \Delta$

“Are there (minimal) candidates besides  $D$ ?”

$$S_{find}(D) = \mathcal{H} \setminus \{h \in \mathcal{H} \mid \exists h' \in D : h' \preceq h\}$$

## Examples of Tests (2/2)

### Refinement of $\delta$

*"Is there a strictly better candidate than  $\delta$ ?"*

$$S_{\text{ref}}(\delta) = \{h \in \mathcal{H} \mid h \preceq \delta \wedge h \neq \delta\}$$

### Relevance of $h$ with respect to $D$

*"Is there a candidate that is a descendant of  $h$  and not a descendant of a hypothesis of  $D$ ?"*

$$S_{\text{ess}}(h, D) = \{h' \in \mathcal{H} \mid h \preceq h'\} \setminus \{h' \in \mathcal{H} \mid \exists h'' \in D : h'' \preceq h'\}$$

# Implementations

## Classical Planning

Testing = finding a sequence of actions with certain constraints on the sequence

## SAT

Testing = satisfiability testing of a formula

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# Preferred-First Strategy

## Principle

- Test candidacy of the preferred hypotheses first,
- When the test of  $h$  fails, generate successors from children and test candidacy of them
- If a hypothesis  $h$  is a descendant of a proven candidate, ignore  $h$

## Theorem

PFS terminates and returns the solution if the hypothesis space is finite

# Preferred-First Strategy + Essentiality

## Principle

- Test the preferred hypotheses first,
- When the test of  $h$  fails, generate successors from children and test them
- If a hypothesis  $h$  is a descendant of a proven candidate, ignore  $h$
- Ignore irrelevant hypotheses (with respect to the open list and the candidates already found)

## Theorem

PFS+e terminates and returns the solution if the diagnosis is finite, the set of children of each hypothesis is finite, and every hypothesis has finite depth

# Preferred-Last Strategy

## Principle

Iteratively, starting with  $D = \emptyset$

- Test completeness of  $D$
- Add the candidate found to  $D$

Remove the non minimal candidates

## Theorem

PLS terminates and returns the solution if the hypothesis space is well partially ordered

# Preferred-Last Strategy + Refinement

## Principle

Iteratively, starting with  $D = \emptyset$

- Test completeness of  $D$
- Refine the candidate found until a minimal candidate is found
- Add the candidate found to  $D$

~~Remove the non-minimal candidates~~

## Theorem

PLS+r terminates and returns the solution if the diagnosis is finite, and the hypothesis space is well-founded

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# Theoretical Comparison

## Number of Tests

	PFS	PFS+e	PLS	PLS+r
Successes	$n$	$n \times d$	unb.	unb.
Failures	unb.	$k \times n \times d$	1	$n$
Types of tests	Q1	Q1 & Q4	Q2	Q2 & Q3

## Parameters

- How many tests?
- How “complex” the test set?
- How hard for the test solver?

# Experiments

## Power Grid Alarms: runtime

Pb	#c	#a	#d	PFS+e	PLS	PLS+r
c-004	2	3	1	0.4	0.3	0.4
c-026	12	11	2	18.5	89.5	23.8
c-076	11	8	2	8.9	7.1	6
c-091	25	16	32	1412	—	785
c-111	26	16	8	358	691	173
w-132	16	7	2	14.4	10.5	8.4
w-331	62	44	16	—	—	545
w-338	42	31	2	820	—	166

# Conclusion

## Results

- First approach to exhaustive diagnosis of discrete-event systems based on consistency tests
- Definition of two classes of strategies

## Next Step

Conflict