



Antonio Guerriero

Tutor: Stefano Russo – co-Tutor: Roberto Pietrantuono

XXXIV Cycle - I year presentation

Testing in the context of Artificial  
Intelligence (AI):  
the oracle problem



# My Background

- Master degree in Computer Engineering
  - Thesis: “Reliability Assessment of Microservice Architectures”
- 1 conference Publication
  - R. Pietrantuono, S.Russo, A. Guerriero,  
“Run-time Reliability Estimation of Microservice Architectures”,  
Proc. of the 2018 IEEE International Symposium on Software Reliability  
Engineering (ISSRE), Memphis, TN, USA, Oct. 15-18, IEEE, 2018,  
– Winner of “ISSRE 2018 Best Research Paper Award”



# Period abroad

- From September 2<sup>nd</sup> 2019 I started a study and research period abroad (six-months) at Chinese University of Hong Kong,
- Visiting the group of prof. Michael Lyu (research areas: Software reliability; Software engineering; Distributed systems; author of the Handbook of Software Reliability Engineering)
- Started joint collaboration on software testing for AI-based systems



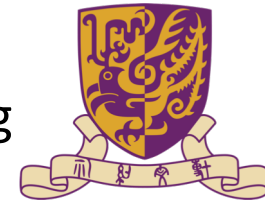
Prof. **Michael R. Lyu**

Chairman, Dept of Computer Science and Engineering  
Chinese University of Hong Kong

IEEE Fellow

ACM Fellow

AAAS Fellow



The Chinese University of Hong Kong

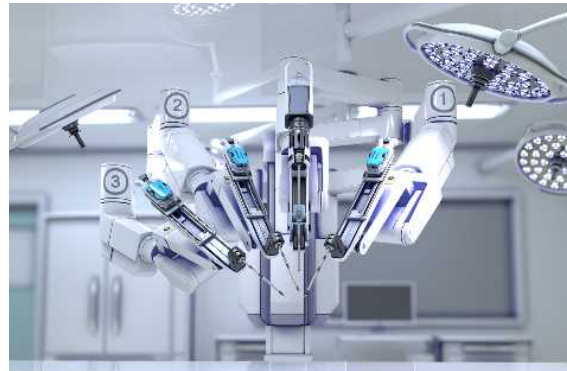
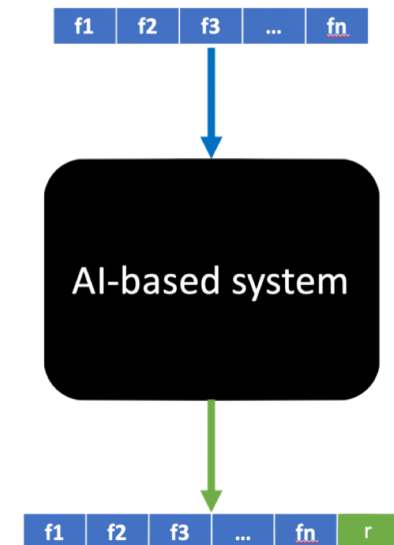
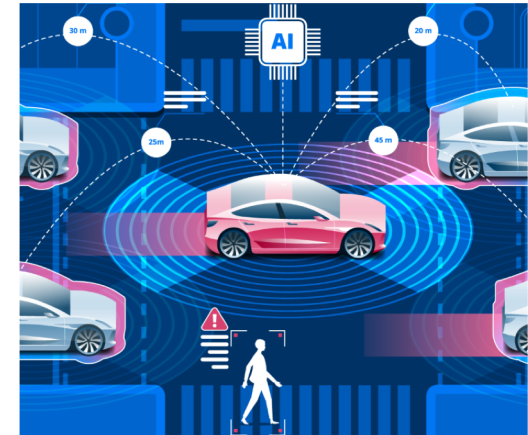


# Research activity: Overview

- **Problem:**
  - Traditional software testing techniques not adequate to test programs based on Artificial Intelligence
  - *The “oracle problem”*: there is no reliable “test oracle” to indicate what the correct output should be for arbitrary input
- **Objective:**
  - Build an entity able to tell **when the output** of an *AI-based program is wrong*
- **Contribution:**
  - Definition of an architectural view of a **test failure detector**, which is able to detect a certain subset of failures, with an acceptable trade-off between *accuracy* and *automation*

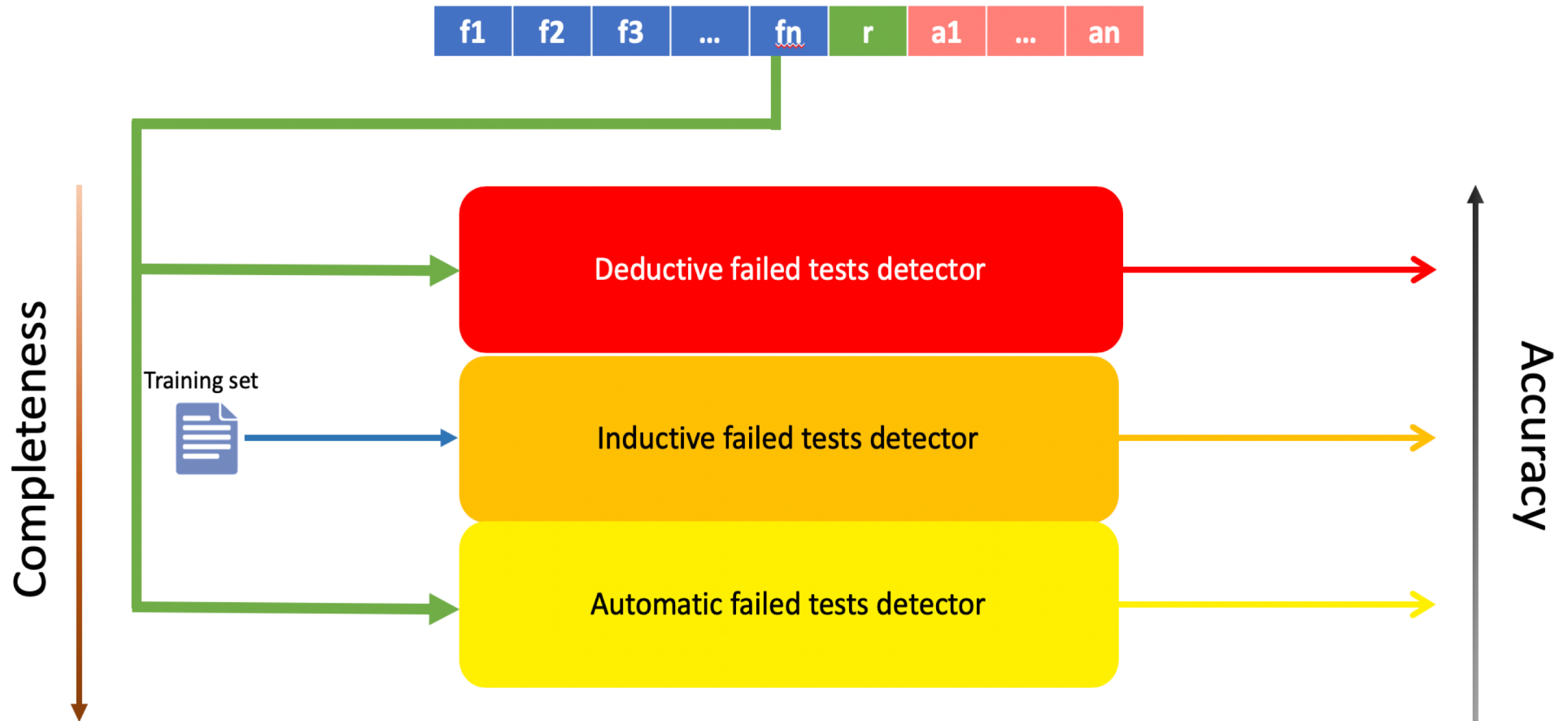
# Subjects

- We define as **AI-based systems** those that have an AI as main component
- This kind of systems are usually characterized by a *very complex input* (made by a feature vector), and by producing in output a *response* and a set of additional pieces of information (*additional features*) produced by the other components
- The behavior of the system is strongly dependent from the training set and from the chosen AI algorithm



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# Proposed architecture



# Products

[P1]	A. Guerriero, R. Mirandola, R. Pietrantuono, S. Russo. “ <i>A Hybrid Framework for Web Services Reliability and Performance Assessment</i> ”. <b>1st International Workshop of Governing Adaptive and Unplanned Systems of Systems (GAUSS 2019)</b> , In: Proc. of the 2019 IEEE International Symposium on Software Reliability Engineering Workshops (ISSREW), pp. 185-192, IEEE.
[P2]	S. Russo, R. Pietrantuono, A. Guerriero, “ <i>Testing Microservice Architectures for Operational Reliability</i> ”. <b>Software Testing, Verification and Reliability</b> (Accepted for publication).
[P3]	S. Russo, R. Pietrantuono, A. Guerriero, A. Bertolino, B. Miranda, “ <i>Learning-to-Rank vs Ranking-to-Learn: Strategies for Regression Testing in Continuous Integration</i> ”. <b>Submitted</b> to the <b>42<sup>nd</sup> International Conference on Software Engineering (ICSE 2020)</b> , Seoul, Korea, May 2020. Status: under review.
[P4]	S. Russo, R. Pietrantuono, A. Guerriero, A. Bertolino, B. Miranda, G. De Angelis, “ <i>DevOpRET: Continuous Reliability Testing in DevOps</i> ”. <b>Submitted</b> to <b>Journal of Software: Evolution and Process</b> . Status: under review.



# First year credits and objectives

	Year 1							Year 2	Year 3	Total	Check	
	1	2	3	4	5	6	Summary	Estimated	Estimated			
	Estimated	bimonth	bimonth	bimonth	bimonth	bimonth	bimonth	Summary	Estimated	Estimated	Total	Check
<b>Modules</b>	<b>20</b>	1.2	0.8	12.5	9.0		2.4	<b>25.9</b>	<b>5</b>	<b>0</b>	<b>30.9</b>	<b>30-70</b>
<b>Seminars</b>	<b>10</b>	1.2	1.0		10.0	0.4	0.2	<b>12.8</b>	<b>0</b>	<b>0</b>	<b>12.8</b>	<b>10-30</b>
<b>Research</b>	<b>35</b>	3.0	6.0	6.0	3.0	9.0	10.0	<b>37.0</b>	<b>45</b>	<b>60</b>	<b>142</b>	<b>80-140</b>
	<b>65</b>	5.4	7.8	18.5	22.0	9.4	12.6	<b>75.7</b>	<b>50</b>	<b>60</b>	<b>185.7</b>	<b>180</b>