

Does Error Resilience Matter in the age of Approximate Computing ?



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What this talk is about

- **Approximate Computing:** Exact results don't matter (much) - compromise on correctness
- **Error-Resilient Computing:** Can we produce correct results in the presence of hardware faults ?
- **Question:** If correctness does not matter, then is it worth the trouble to build error resilient systems ?

What this talk is about

Which one are you?

Approximate
Computing



1/2 FULL?



1/2 EMPTY?

Error Resilient
Computing

Approximate Computing: Myths and Reality

- **Myth 1:** Soft computing applications can tolerate almost all errors in their data
- **Myth 2:** Crashes are harmless. SDCs or output corruptions are what matter in practice.
- **Myth 3:** Programmers are good at writing correctness checks or annotations in the code

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Soft Computing Applications

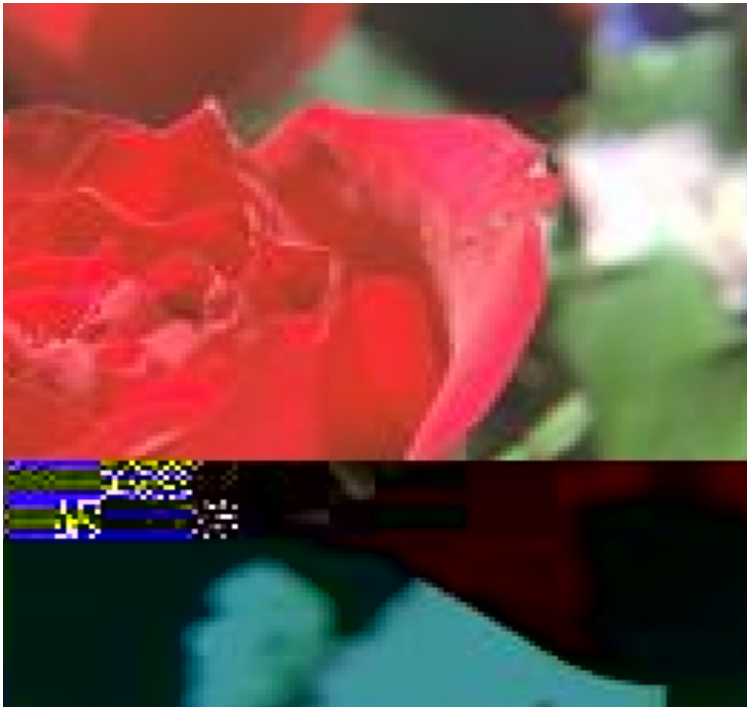
- Applications in machine learning, multimedia etc.



Original image (left) versus faulty image: JPEG decoder

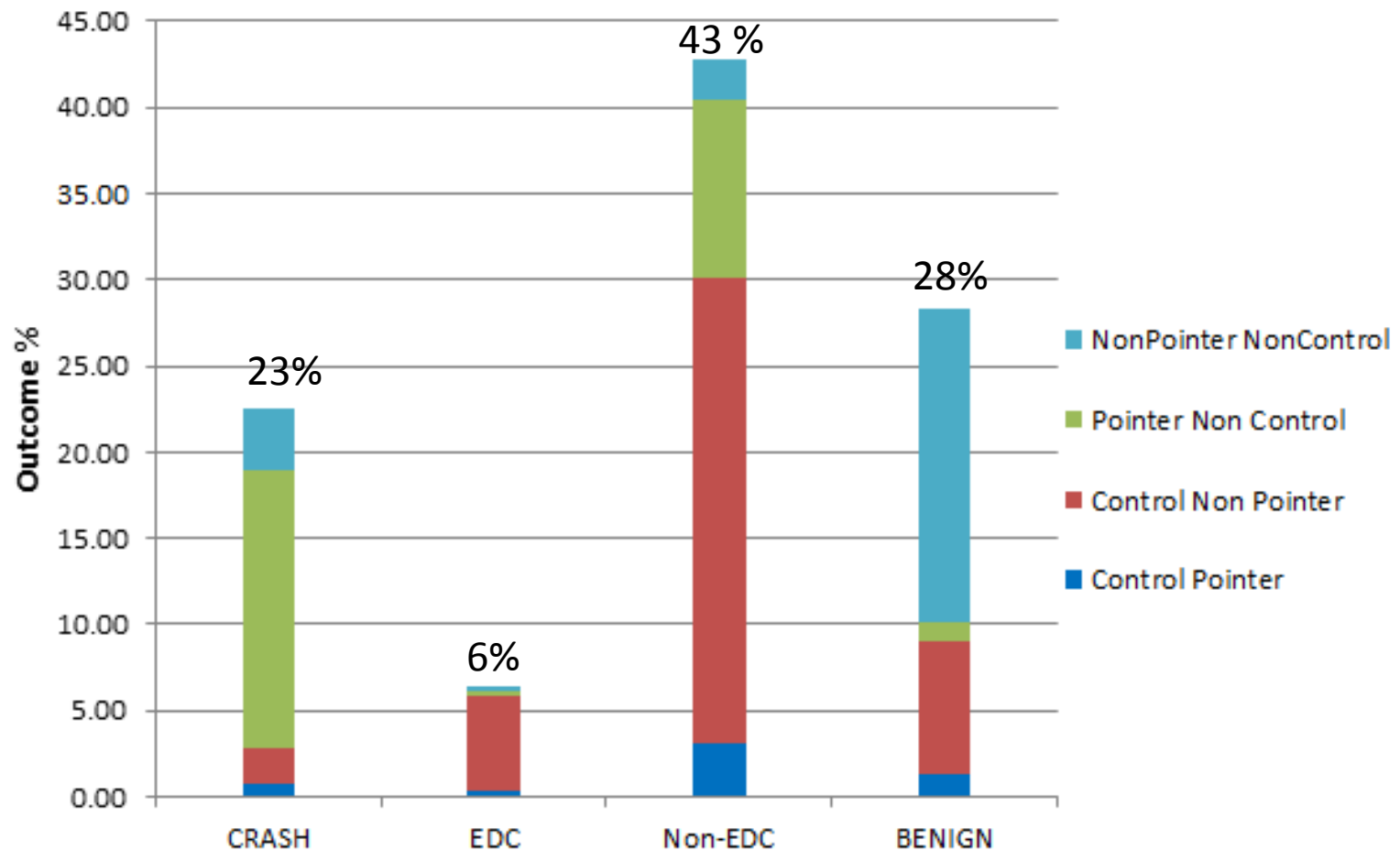
EDCs: What are they ?

- Large or unacceptable deviation in output



EDC image (PSNR 11.37) Vs. Non-EDC image (PSNR 44.79)

Error Resilience: Initial Study

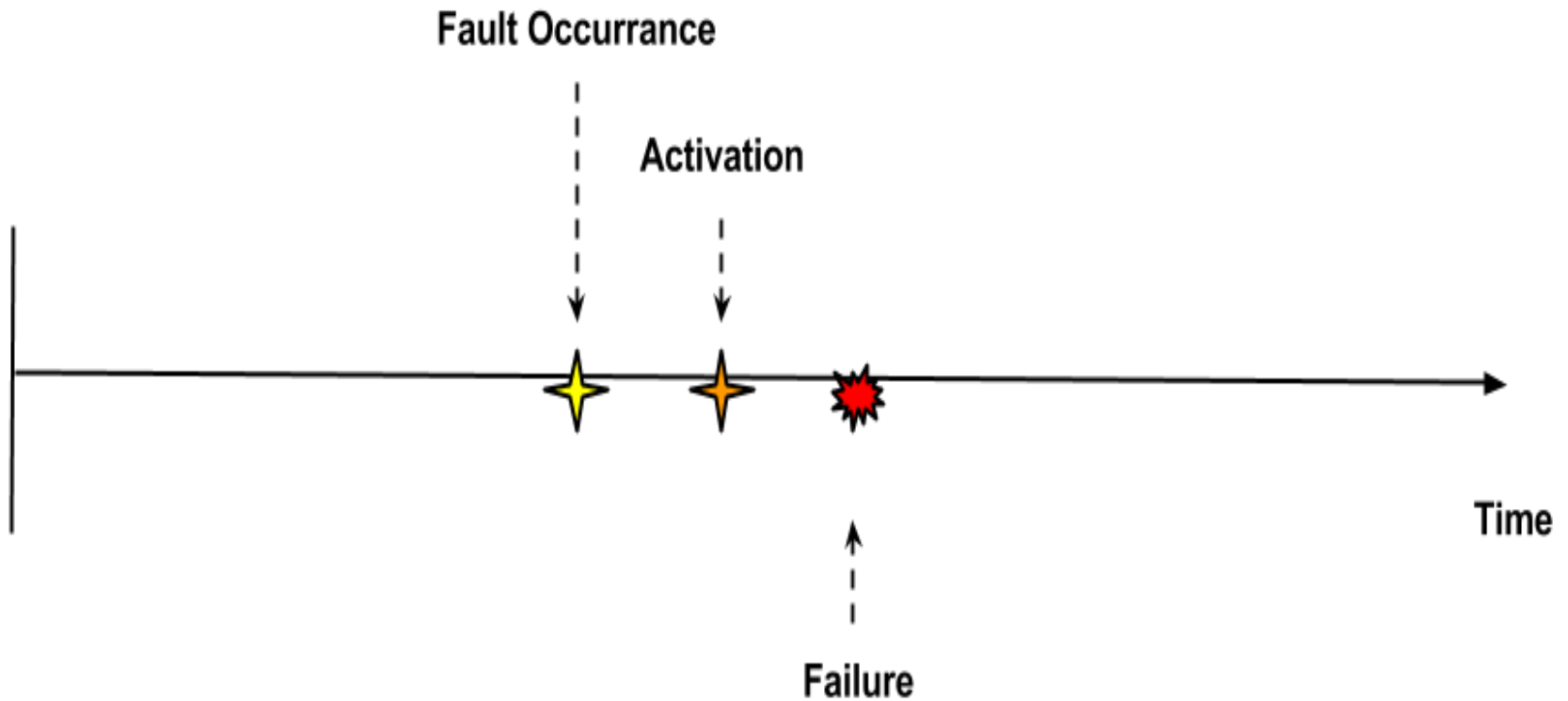


References: DSN'13, SELSE'13, TECS – in press

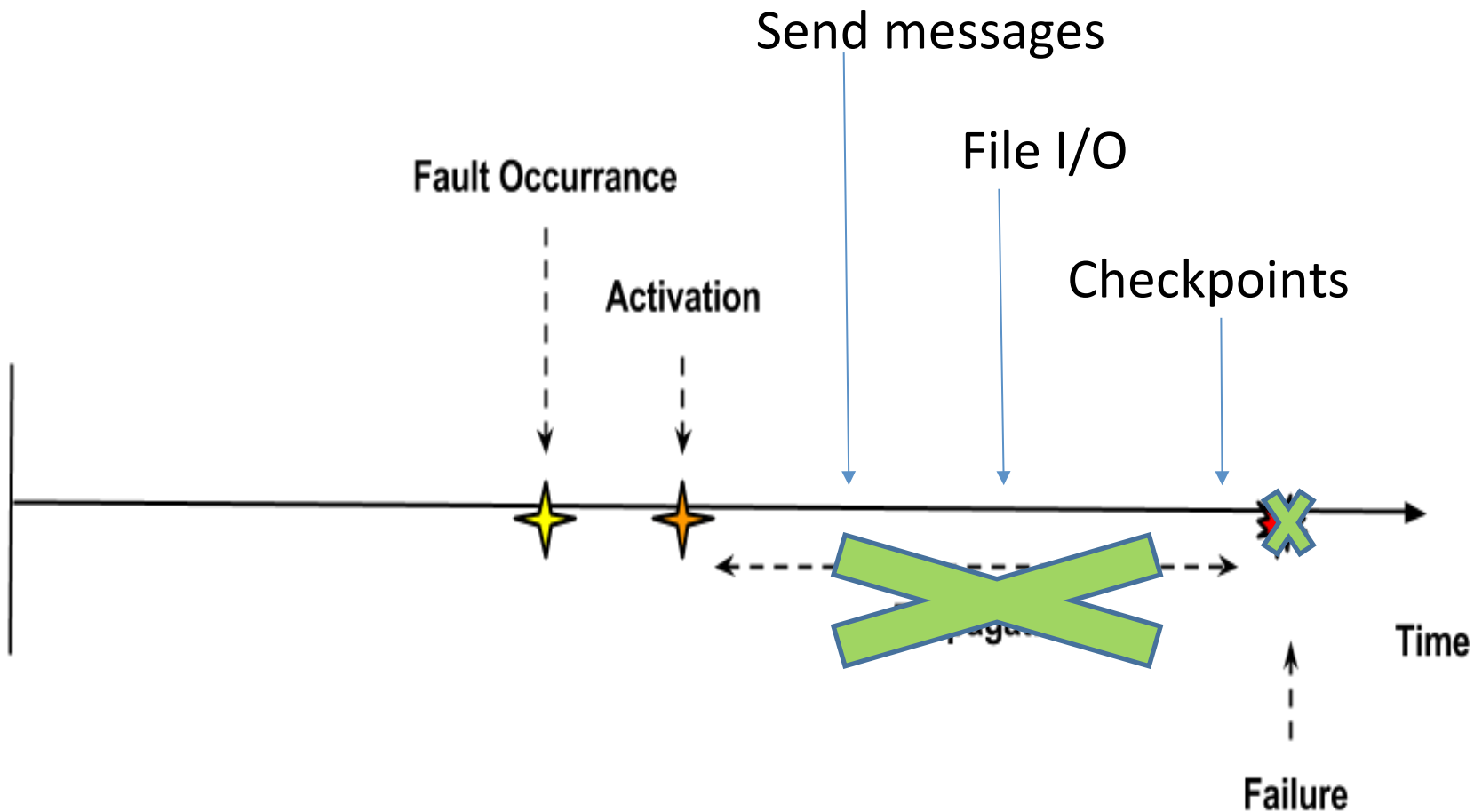
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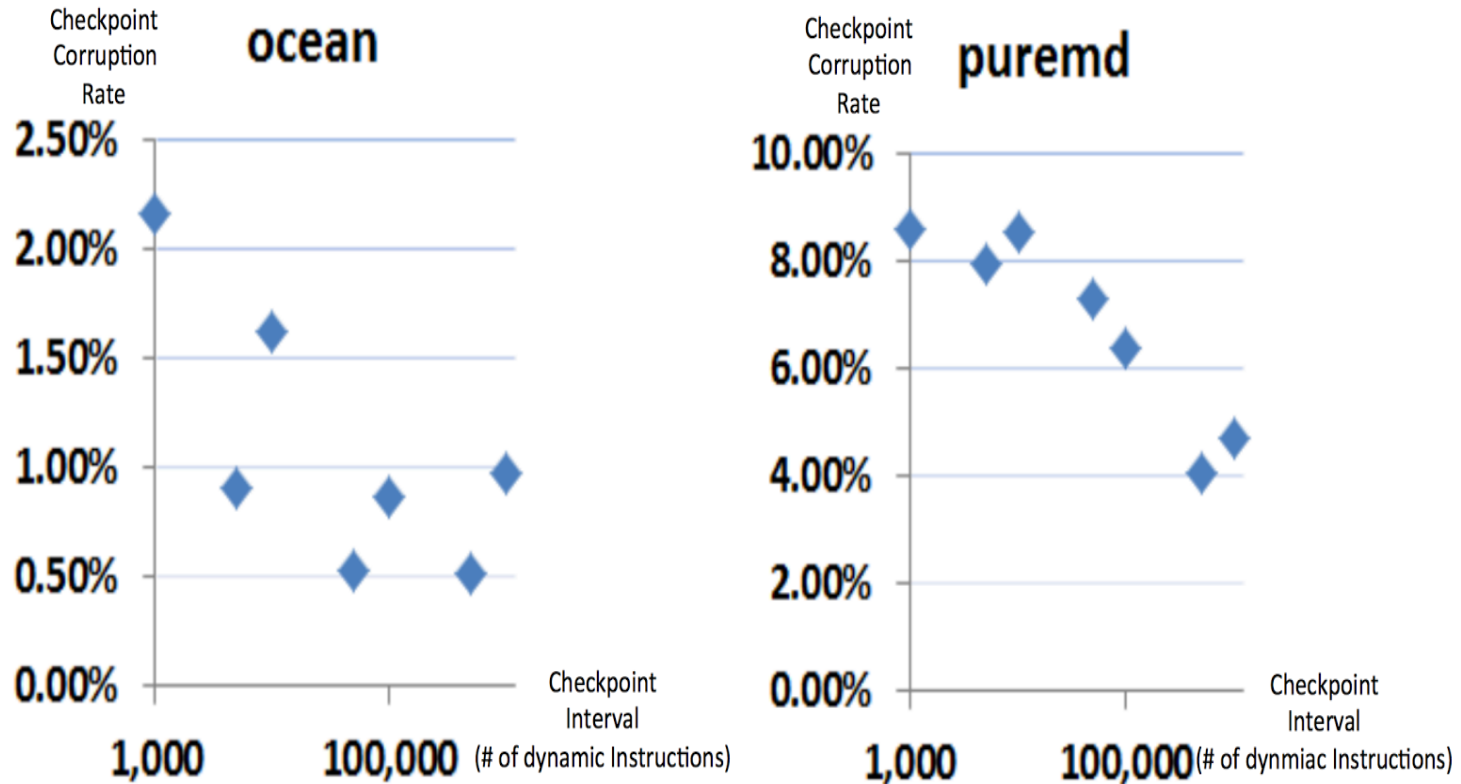
Fail-stop Assumption



Long-latency Crash



Checkpoint Corruptions



References: DSN'15, ISSRE'15

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Programmers are busy !

- Last thing they're going to worry about is annotating data/code as critical or non-critical
- Writing good correctness checks is hard – many checks are either ineffective or wrong
- Finally, programmers tend to be conservative
 - Will mark everything as critical if in doubt

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Error Resilience **DOES** Matter in the age of Approximate Computing !



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