

# On Scheduling of Fuzzing Test

**Hongbo Zhang** ANU

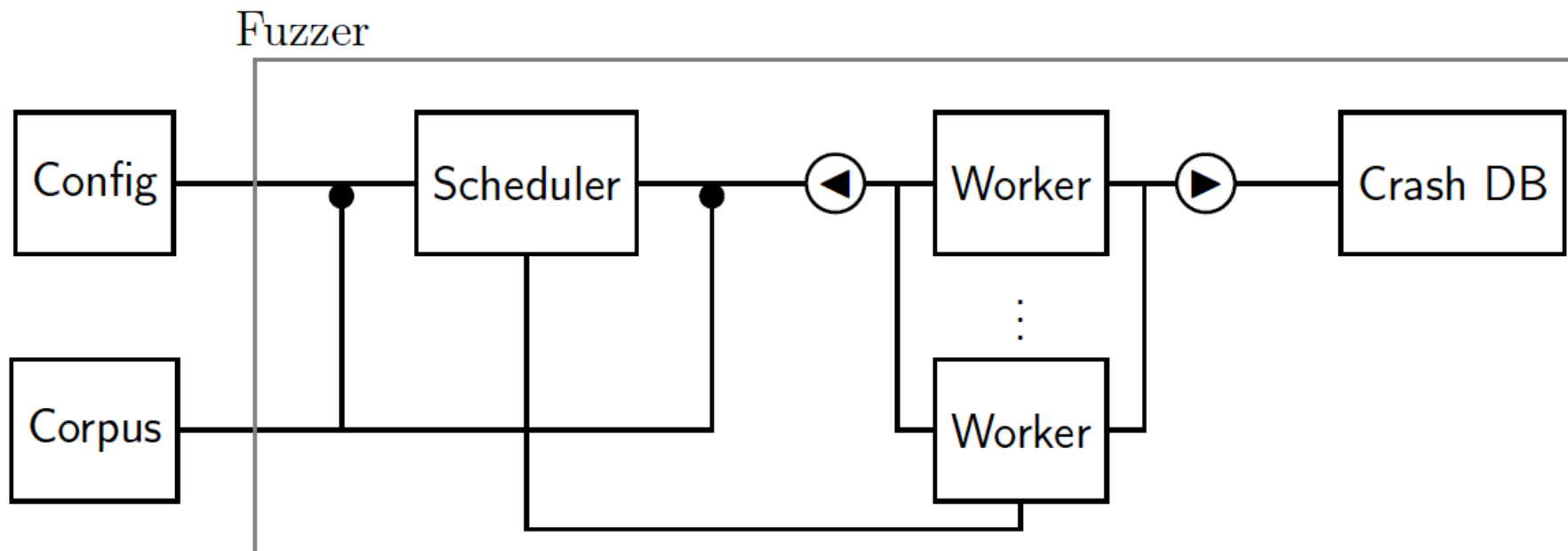
**Superadvisors:** Steve Blackburn, Tony Hosking, Shane Magrath

Feb 13 2017  
Sydney

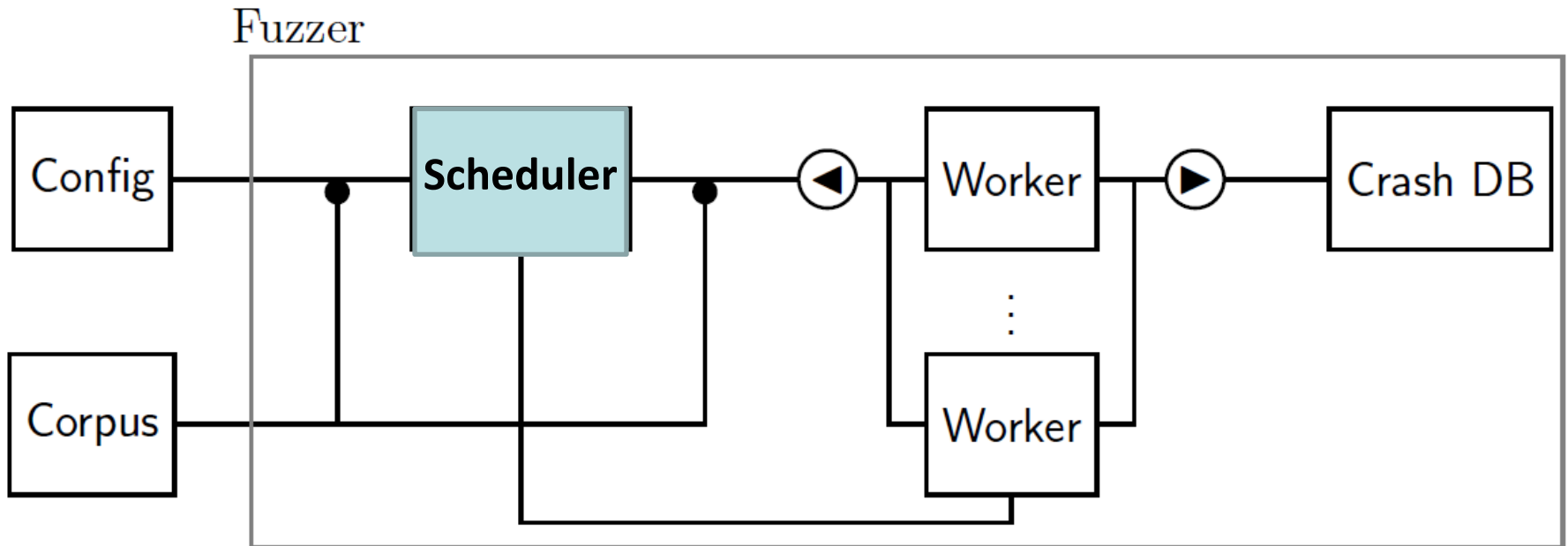
# Overview

- Problem
- Model
- Result
- Discussion

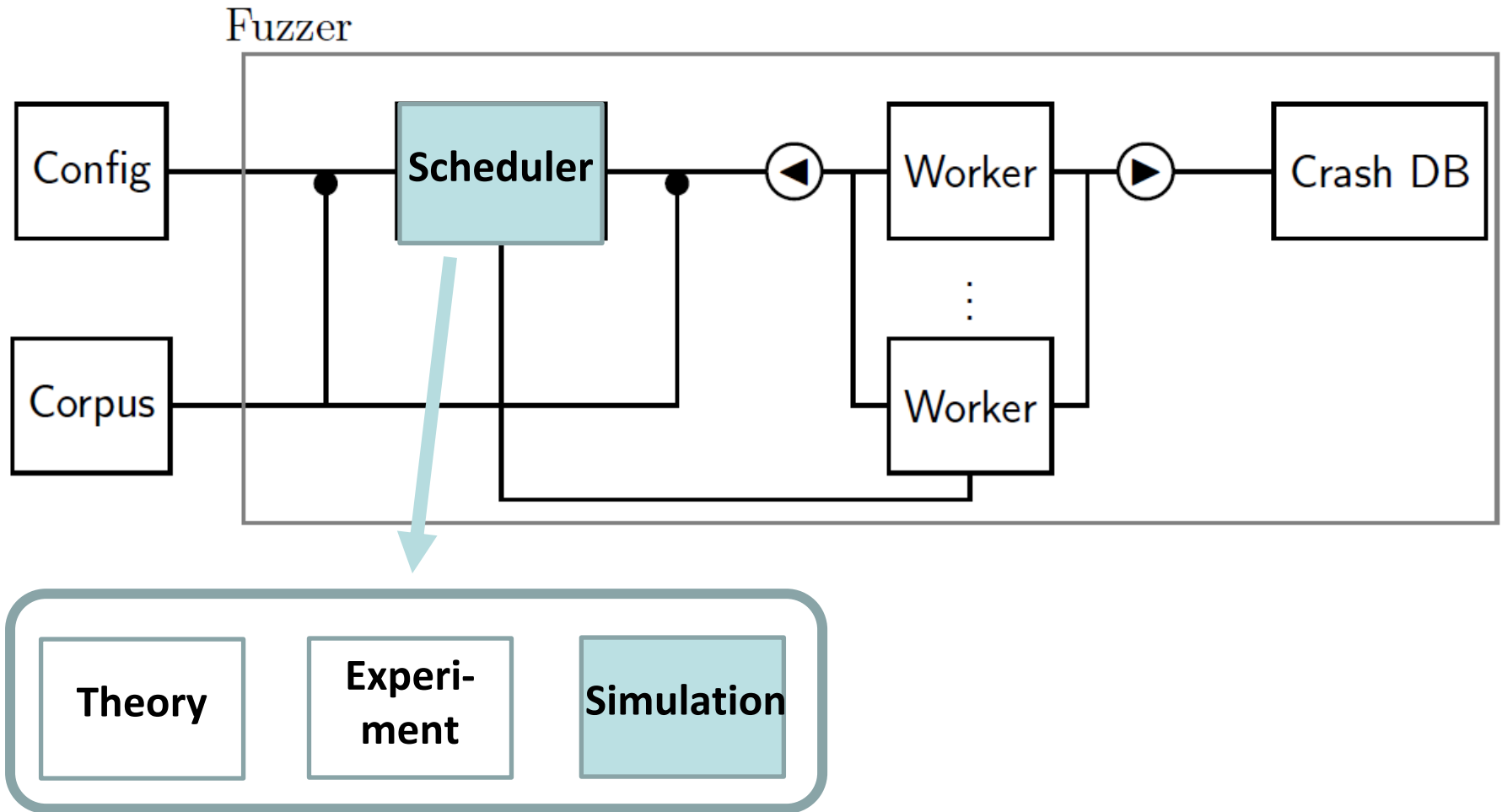
# Fuzzing Test



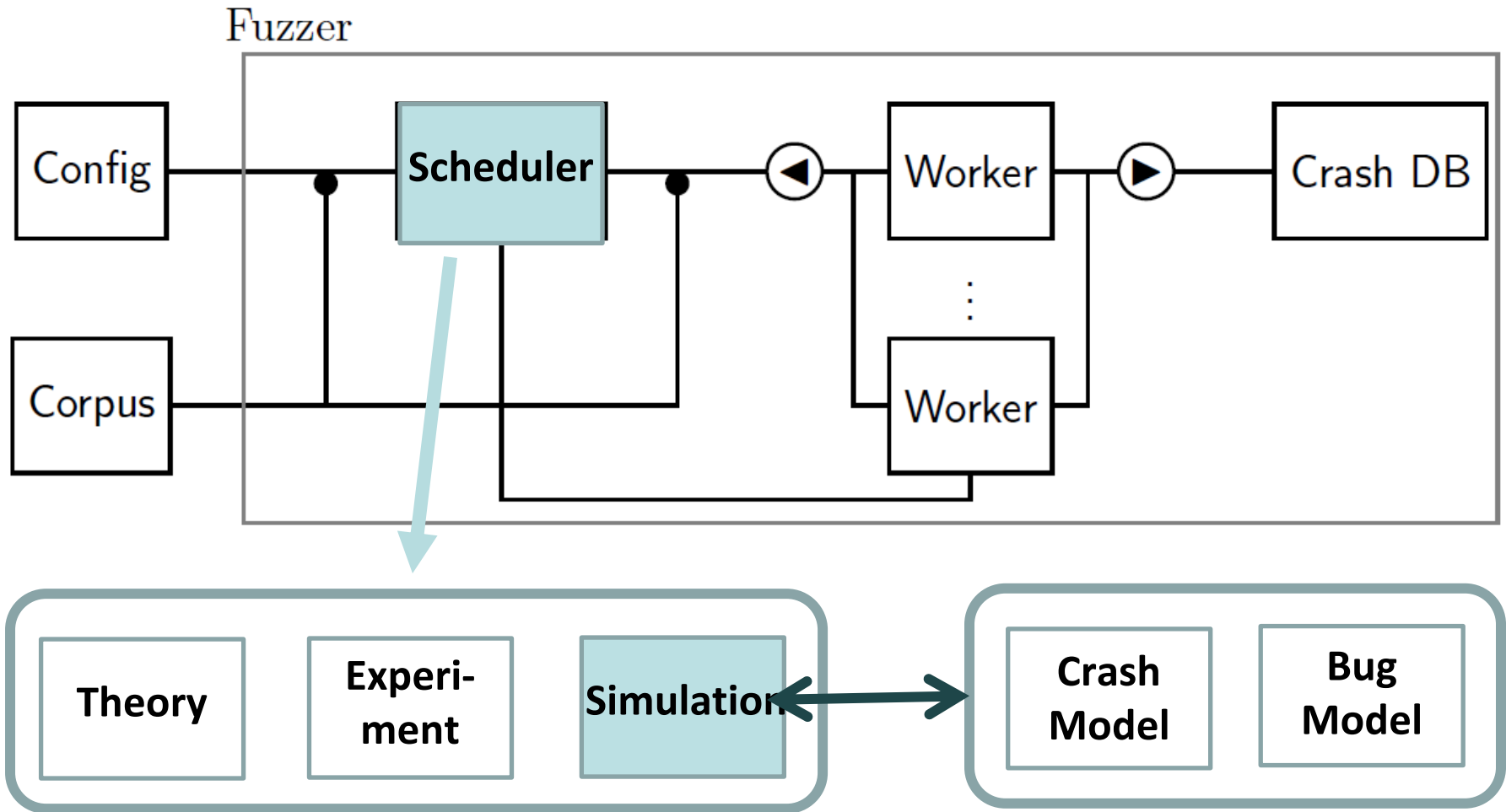
# Fuzzing Test



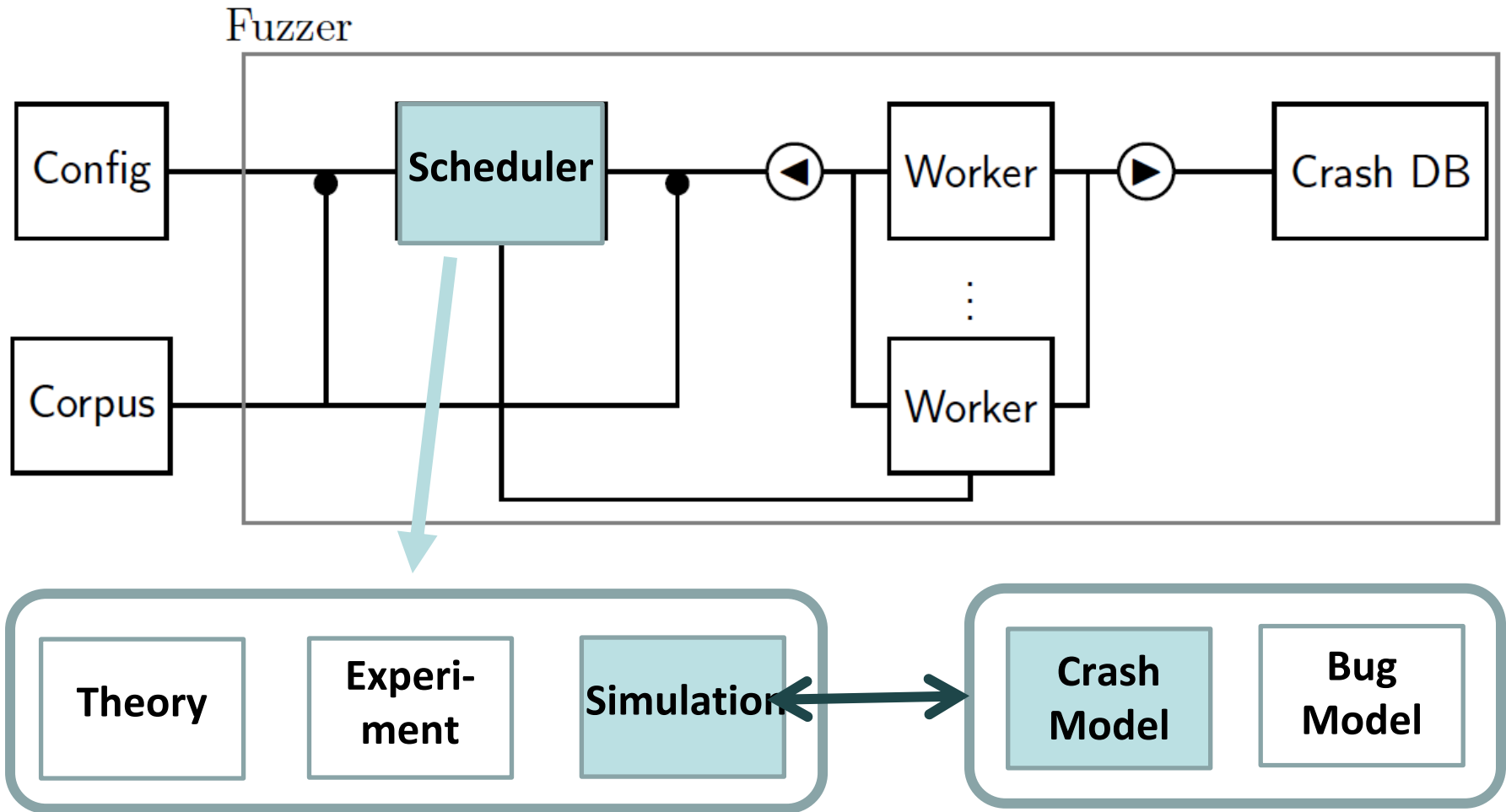
# Fuzzing Test



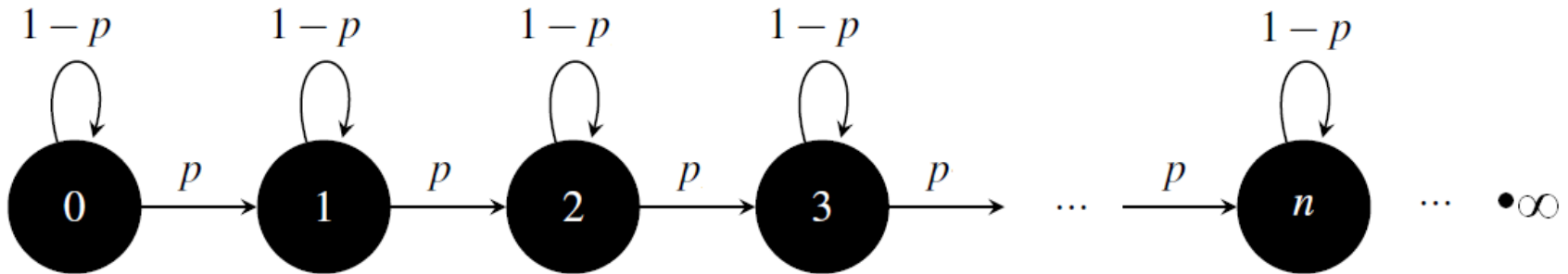
# Fuzzing Test



# Fuzzing Test



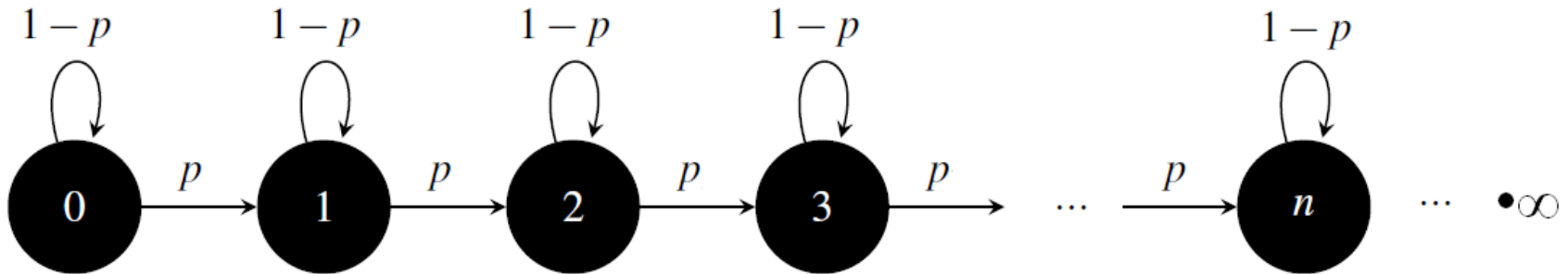
# Model



## Bernoulli Model



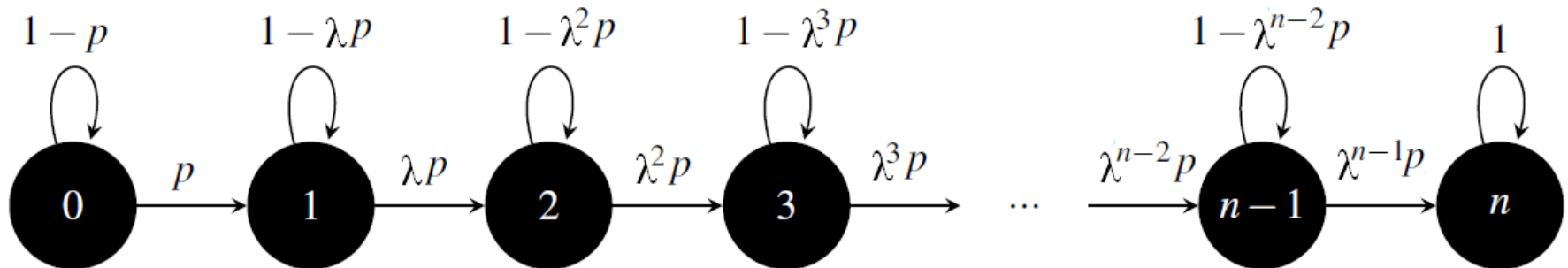
# Crash Model



## Bernoulli Model

- Infinite is impossible
- Probability to find a new unique crash should be decrease.

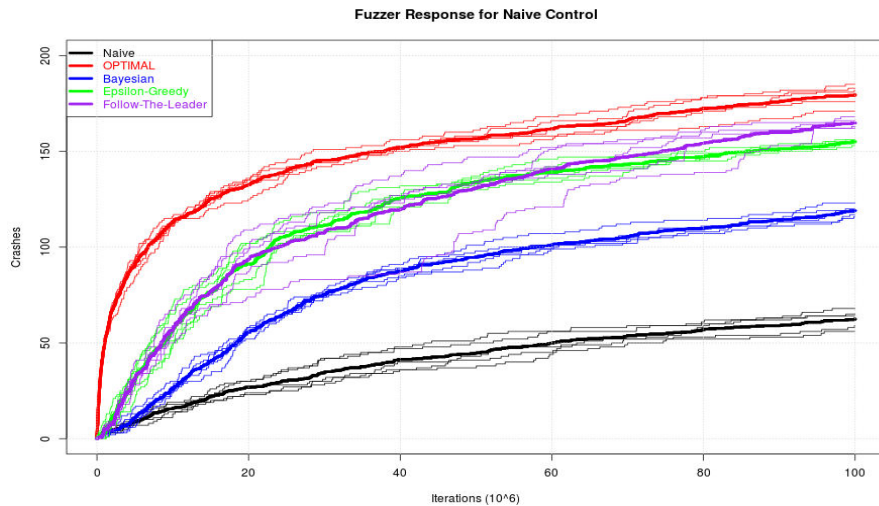
# Crash Model



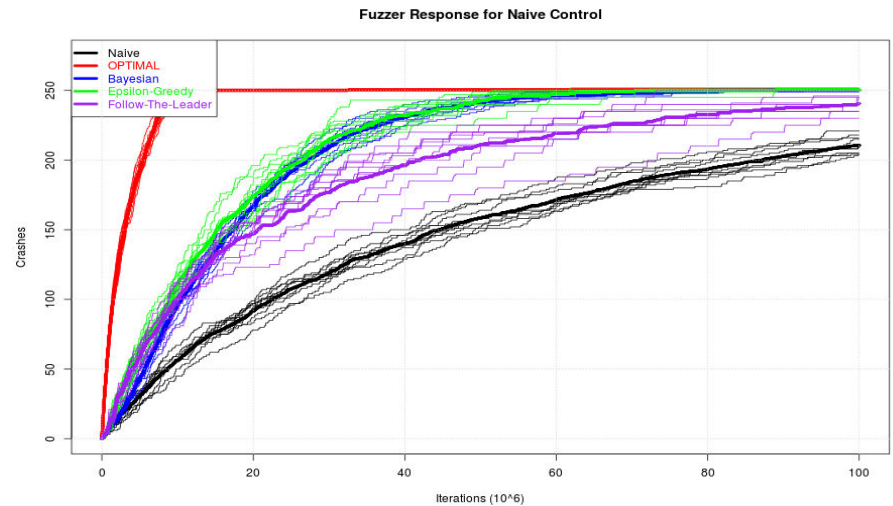
## Limited Crashes Model

- $\lambda$  is decay parameter
- $n$  is unique crashes triggered by a seed potentially
- $p$  is much smaller than 1.
- All of them are unknown as a priori.

# Result: Limited Crashes Model

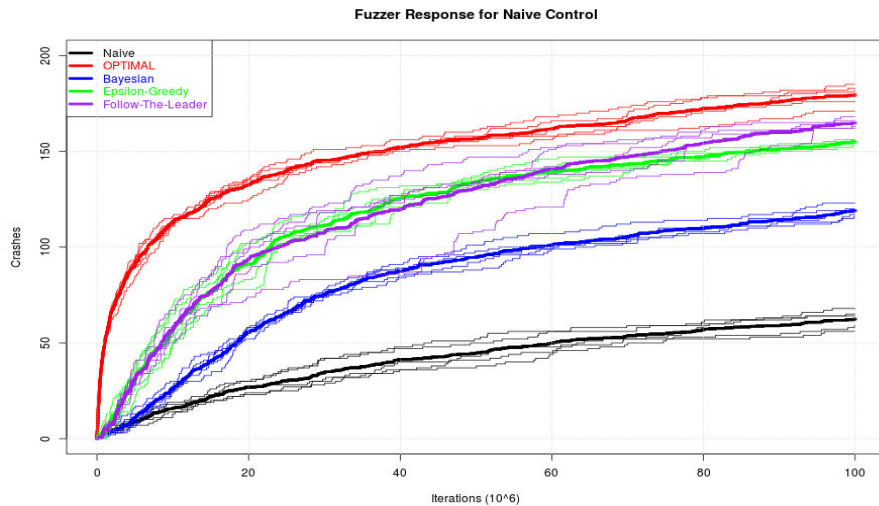


$n \rightarrow \infty$

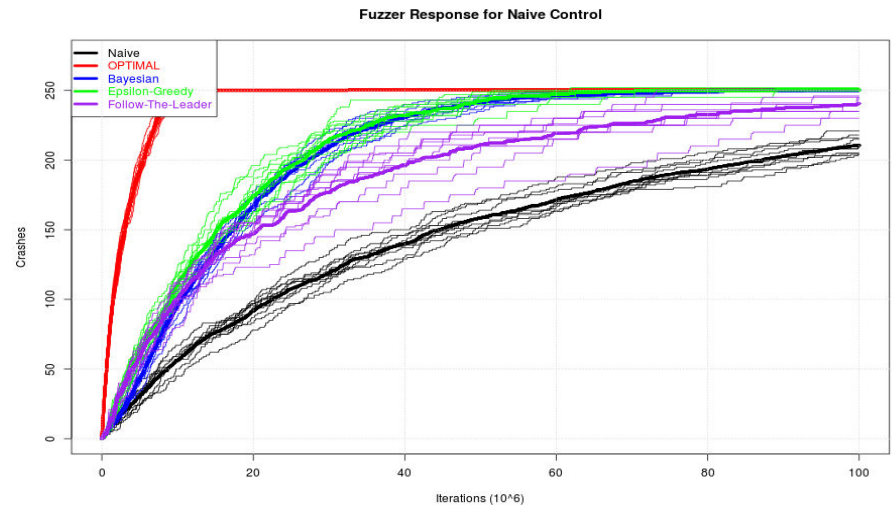


$n = 5$

# Result: Limited Crashes Model



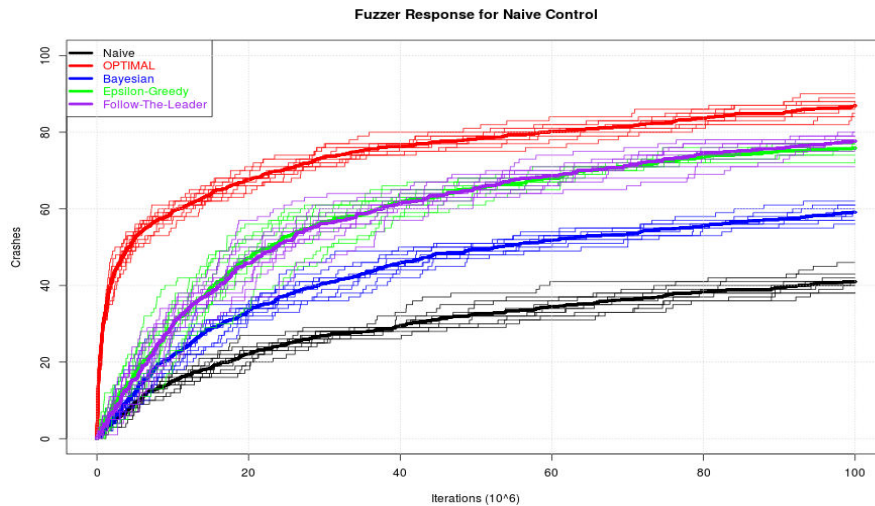
$n \rightarrow \infty$



$n = 5$

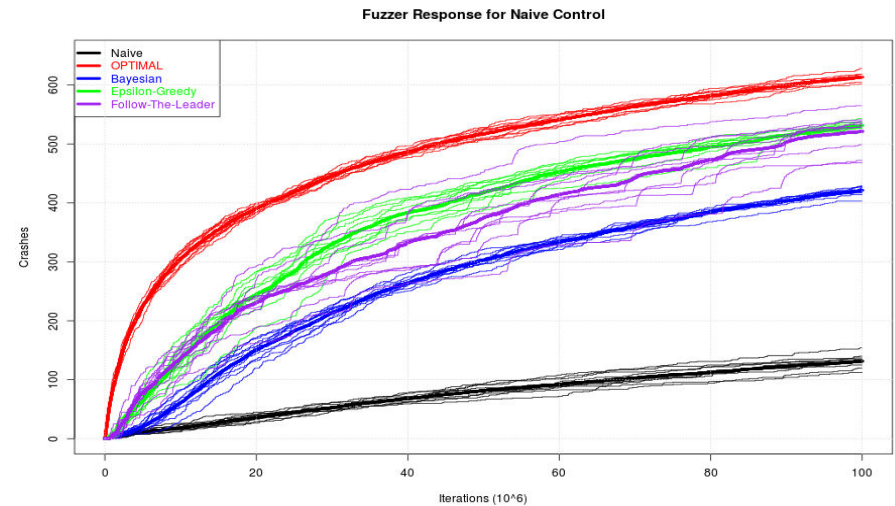
- Exploration vs. Exploitation
- A critical number  $n^*$

# Result: Decay factor



$$\lambda = 0.3$$

- $n \gg n^*$
- Crashes are expected to be found earlier for smaller  $\lambda$ , hence favor more exploration





$$\lambda = 0.9$$

## Result: $\alpha$ -UCB1

To see “explore vs. exploit” more clearly

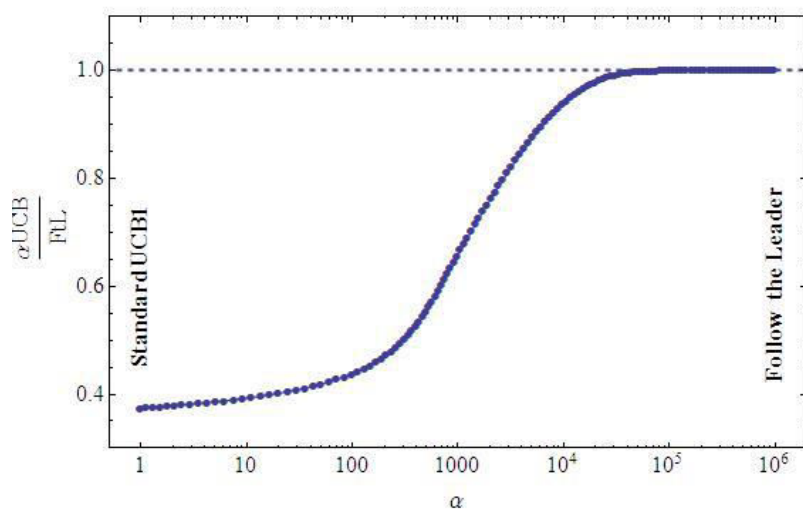
UCB1 :      Mean      +      Variance

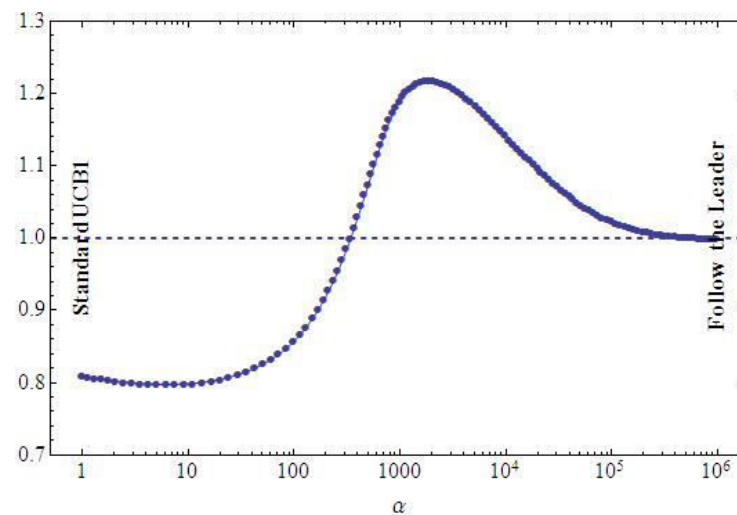
Exploit      Explore

$\alpha$  -UCB1 :       $\alpha \times$ Mean      +      Variance

# Result: $\alpha$ -UCB1



$n \rightarrow \infty$



$n = 5$

# Discussion

- Exploration vs. Exploitation
- Accurate crash modeling is essential in designing a scheduling policy.
- Mortal multi-arm bandits
- Bug model





# THANKS

# Appendix

- $n^*$

$$\frac{a}{\lambda_0} \times \frac{\gamma^{n+1} - 1}{\gamma^{n+1} - \gamma^n} \approx m = t \times c \times w$$