# Reducing Performance Non-determinism via Cache-aware Page Allocation Strategies

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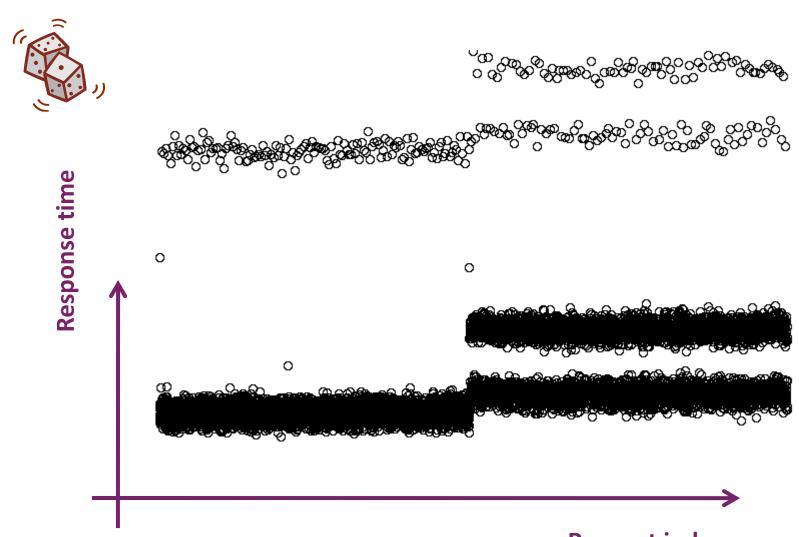
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#### **Performance Non-determinism**

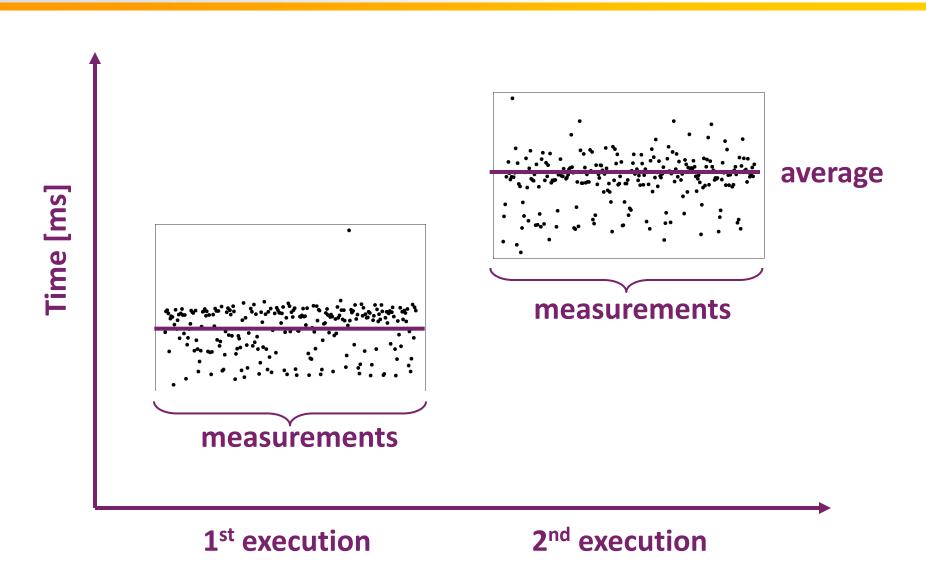


# Non-determinism in execution is particuarly bad for benchmarking

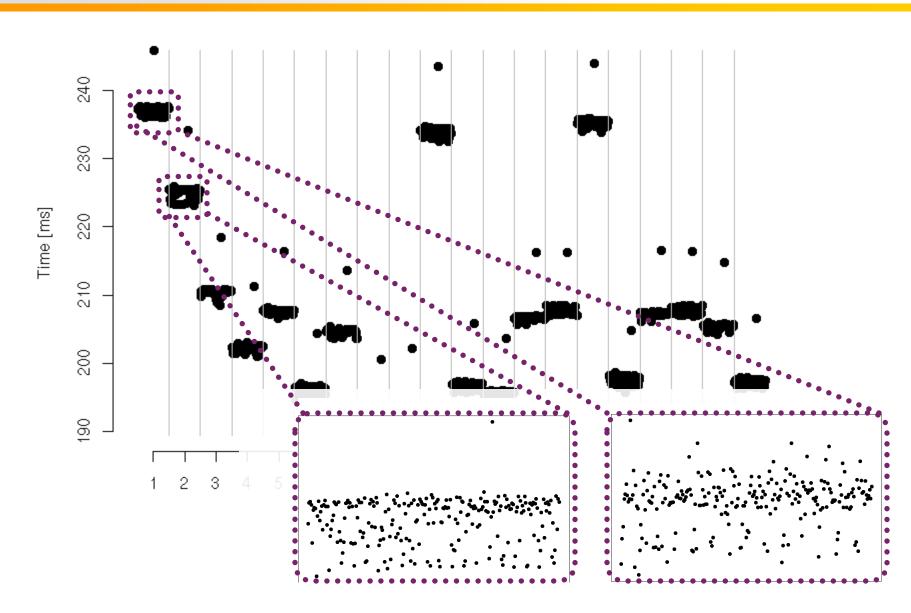
### Sample Benchmark Structure

```
Main() {
  initialize();
  warm-up();
  for (i=0; i < nmeasurements, i++) {</pre>
    before = getCurrentTime();
    doOperation();
                                       One measurement
    after = getCurrentTime();
    results[i] = after - before;
  print(results);
Cmd-line> ./benchmark
Cmd-line> ./benchmark
                                       One execution
Cmd-line> ./benchmark
```

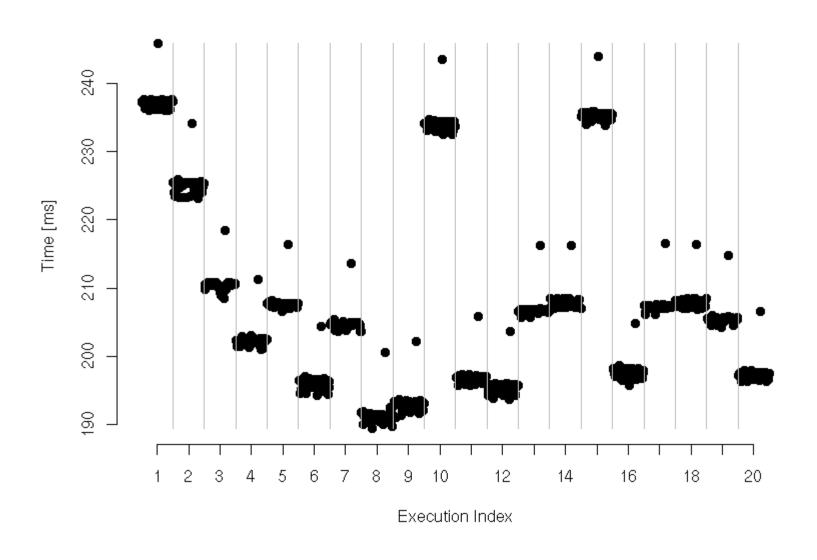
#### **Non-Determinism in Measurement and Execution**



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#### **Non-Determinism in Measurement and Execution**



# **Non-determinism in Execution is Costly**

```
Main() {
                                       Repeated with every
  initialize();
                                       execution
  warm-up();
  for (i=0; i < nmeasurements, i++) =</pre>
    before = getCurrentTime();
                                       One measurement
    doOperation();
    after = getCurrentTime();
    results[i] = after - before;
  print(results);
Cmd-line> ./benchmark
                                       One execution
Cmd-line> ./benchmark
Cmd-line> ./benchmark
```

# Non-determinism in execution is caused by cache & virtual memory

# **Application Memory Layout (Linux)**

Tomas Kalibera WOSP/SIPEW 2010

Virtual memory

Program code Initialized data Non-initialized data Heap



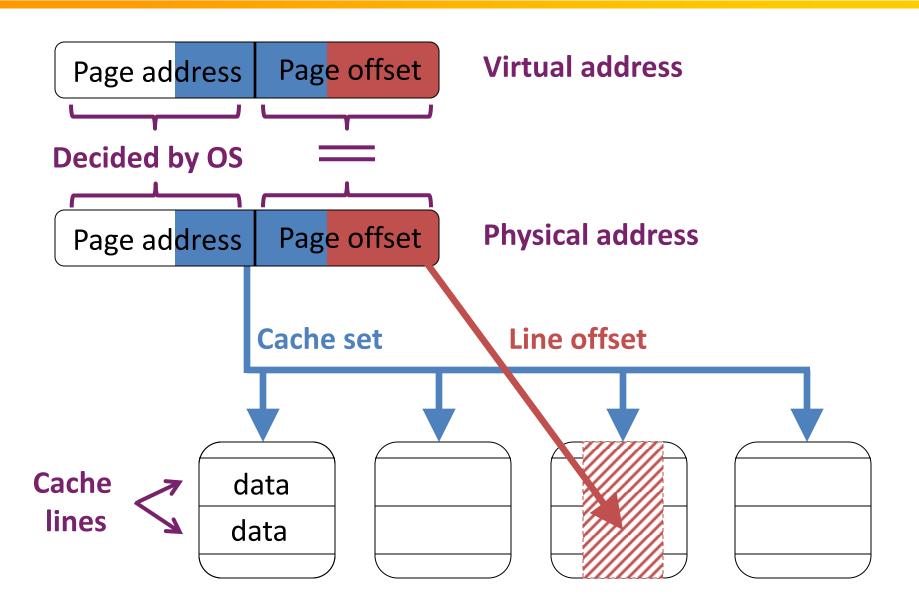


Stack
Cmd-line arguments
Environment

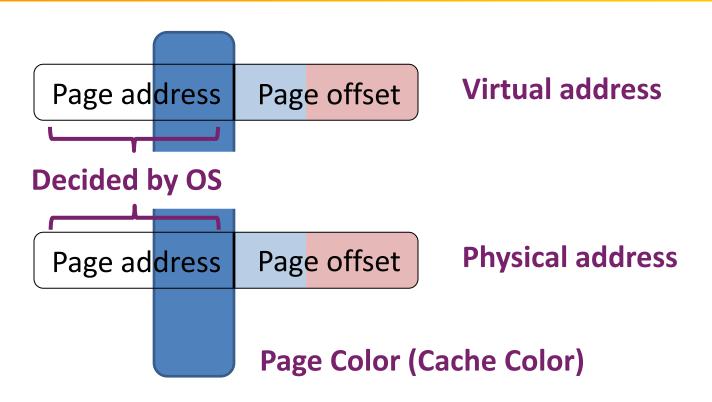
Low virtual addresses

High virtual addresses

# Cache and Addressing on Typical System



# Page/Cache Color



- Operating system assigns colors to pages
- Data from pages of different colors do not collide in the cache

# Could a cache-aware strategy for selecting page colors reduce non-determinism in execution?

# **Good Old Cache-aware Strategies**

Tomas Kalibera WOSP/SIPEW 2010

#### Page Coloring

- Heuristic for "spatial locality"
- Adjacent pages have different color do not collide
- Solaris, Windows, Free BSD

#### Bin Hopping

- Heuristic for "temporal locality"
- Pages first accessed in sequence have different color
- Digital Unix
- No Support in Linux

#### **Our Contribution**

- Linux Kernel extension for strategies
  - Supports bin hopping and page coloring as modules
  - Supports more: other strategies, application layer control, etc
- Large empirical study in Linux
  - 4500 benchmark experiments
  - Evaluation based on statistical methods

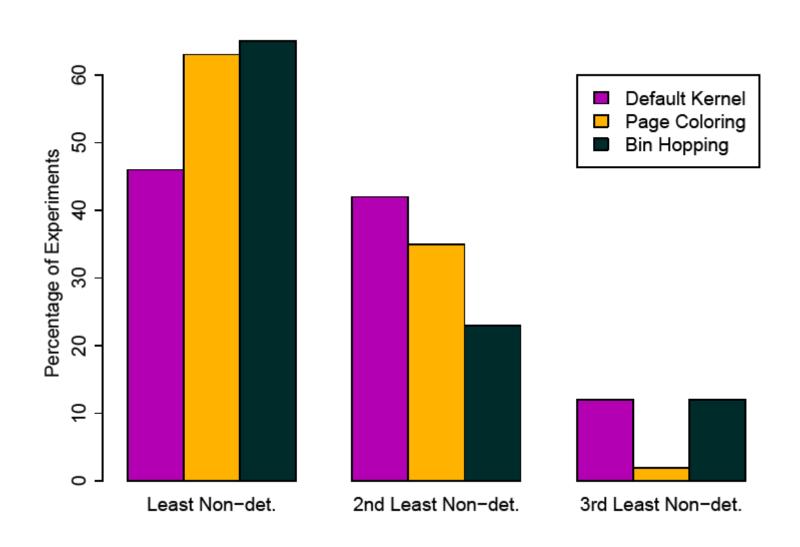
#### **Benchmarks**

- Mono (C#)
  - SciMark2 FFT (numerical)
  - TCP/HTTP Ping (remote communication)
  - Rijndael (cryptography)
- SciMark2 (C, numerical)
  - FFT, Matrix Factorization, Monte Carlo, ...
- Csibe (C/C++)
  - JPEG (multimedia compression)
  - GZIP, BZIP2, PNG (lossless compression)
  - Lexical analysis, abstract machine simulator, ...

# **Evaluation Methodology**

- Executed about 4500 experiments
- Question for evaluation:
  - "Does page coloring or bin hopping provide lower response time/non-determinism than the default kernel strategy?"
- Metrics
  - Mean response time, impact factor of nondeterminism
- Quantitative Summary
- Qualitative Summary

## **Non-det. in Execution: Quantitative Summary**



### **Summary**

- Response time
  - Cache-aware strategies don't help
  - Page coloring performs like default, bin hopping is sometimes slightly slower
- Non-determinism
  - Cache-aware strategies reduce non-determinism
  - Bin hopping sometimes reduces a bit more than page coloring
- Our kernel extension allows to select a strategy on application basis