



# Thesis Defense



*The AFIT of Today is the Air Force of Tomorrow.*

## CLOUD BENCHMARK TESTING OF CASSANDRA ON RASPBERRY PI FOR INTERNET OF THINGS CAPABILITY

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# Overview



*The AFIT of Today is the Air Force of Tomorrow.*

- Motivation
- Problem Statement
- Contributions
- Background and Related Works
- Experiments
- Results
- Conclusions



# Motivation



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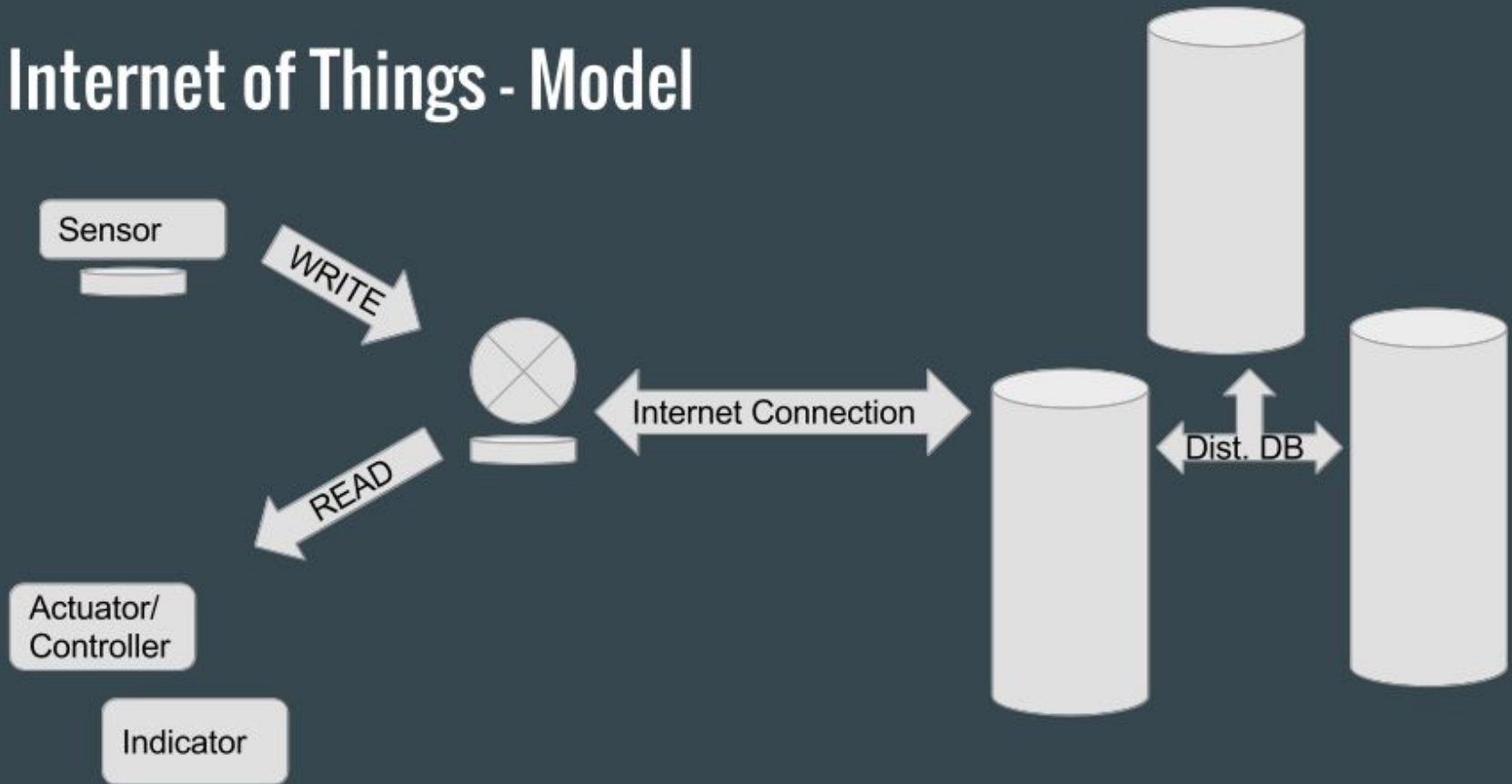
- Application Space
- Traditional v. Thicker Client Model



# Motivation

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## Internet of Things - Model



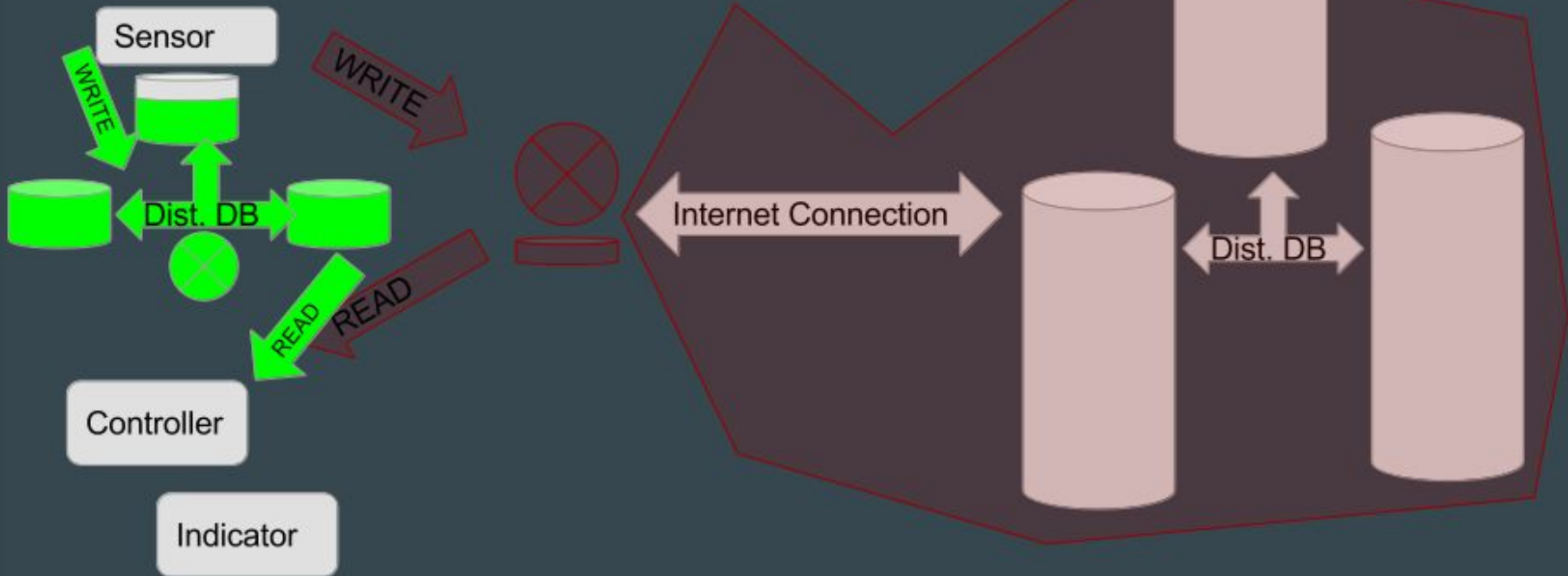
<https://www.cnet.com/news/appliance-science-alexa-how-does-alexa-work-the-science-of-amazons-echo/>



# Motivation

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## Internet of Things - Thicker Clients



<https://www.cnet.com/news/appliance-science-alexa-how-does-alexa-work-the-science-of-amazons-echo/>



# Problem Statement



*The AFIT of Today is the Air Force of Tomorrow.*

- This research seeks to characterize, if any, conditions for feasible operation of distributed database technology on limited hardware.



# Contributions



*The AFIT of Today is the Air Force of Tomorrow.*

- Framework for Evaluation
- Insight into Scalability for Both a Wired and Wireless Configurations
- Performance Comparison between physical devices and virtual devices



# Research Objectives



*The AFIT of Today is the Air Force of Tomorrow.*

- Characterization
- Feasibility





# Research Questions



*The AFIT of Today is the Air Force of Tomorrow.*

- Effect Characterization: Timing and Scalability
  - Variation in RAM
  - Wired vs. Wireless
  - Hardware vs. Virtual



# Related Work



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- Cooper et al. [1]
  - Initial Presentation YCSB
  - Surveys Many Different Databases Optimally Tuned
- Abramova et al.
  - Same Database: Cassandra
  - Expands on Configurations
  - Expands on Workload
- Waddington and Lin
  - Specific Workload for IoT
  - Specific, Custom Database



# Background

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- Cassandra and other databases
- Raspberry Pi and other Hardware
- Yahoo! Cloud System Benchmark



**cassandra**

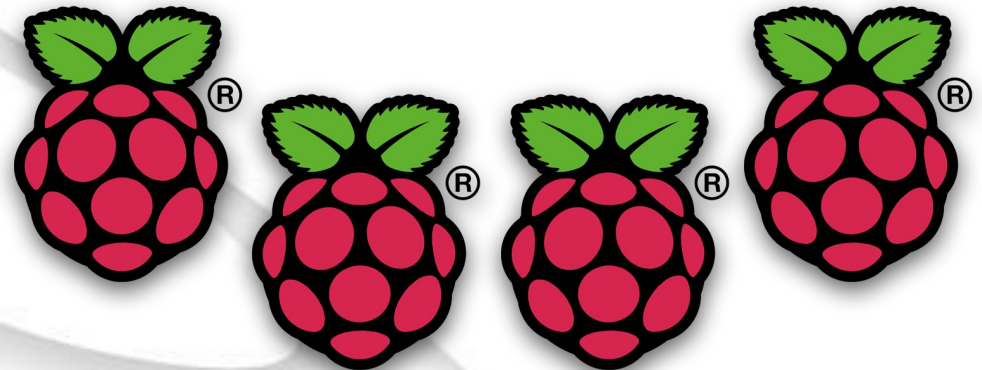


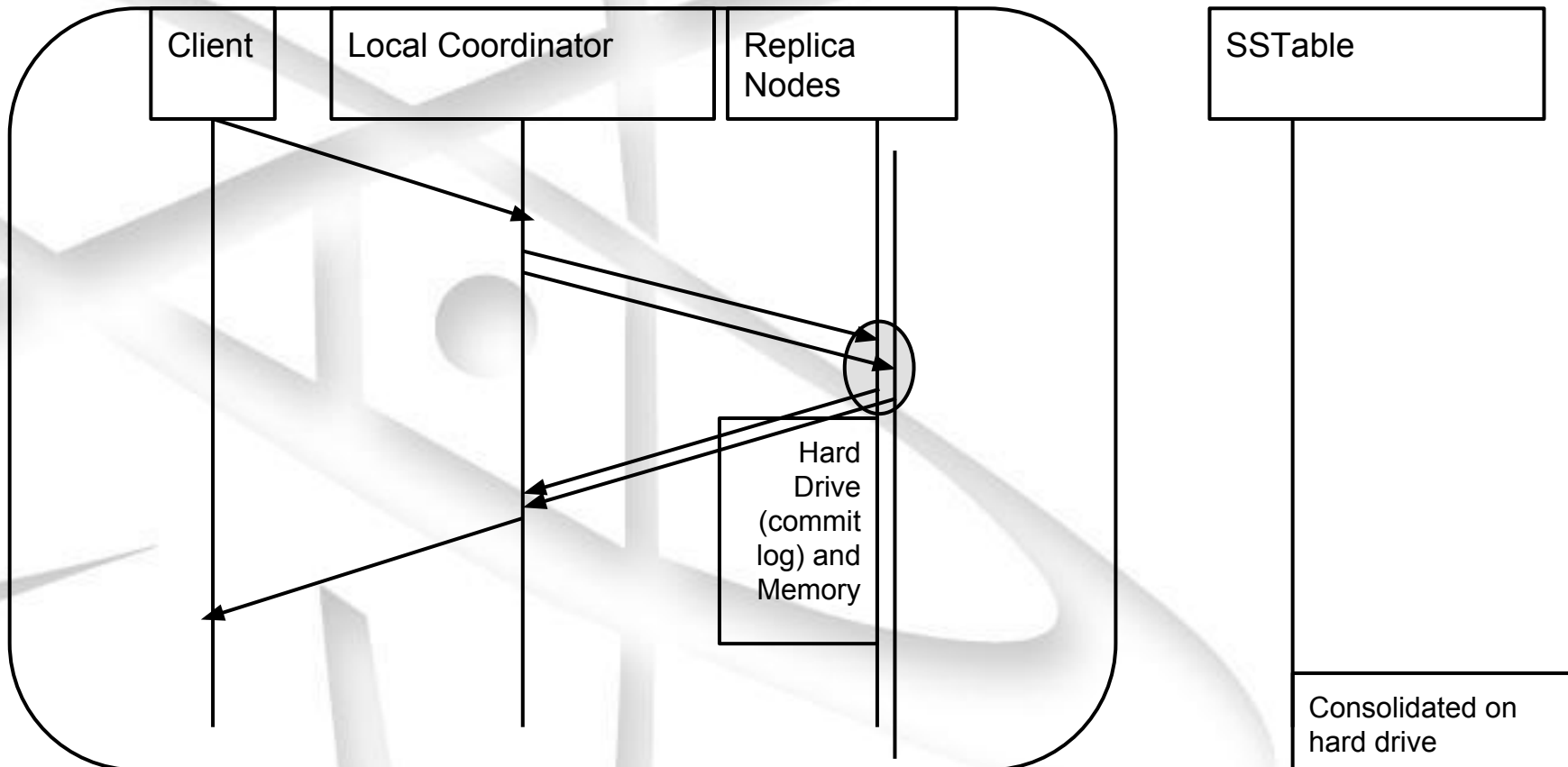
Image licensed By Apache Software Foundation [Apache License 2.0  
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# Background

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## Write Path -- What Counts as a Write in Stress Testing



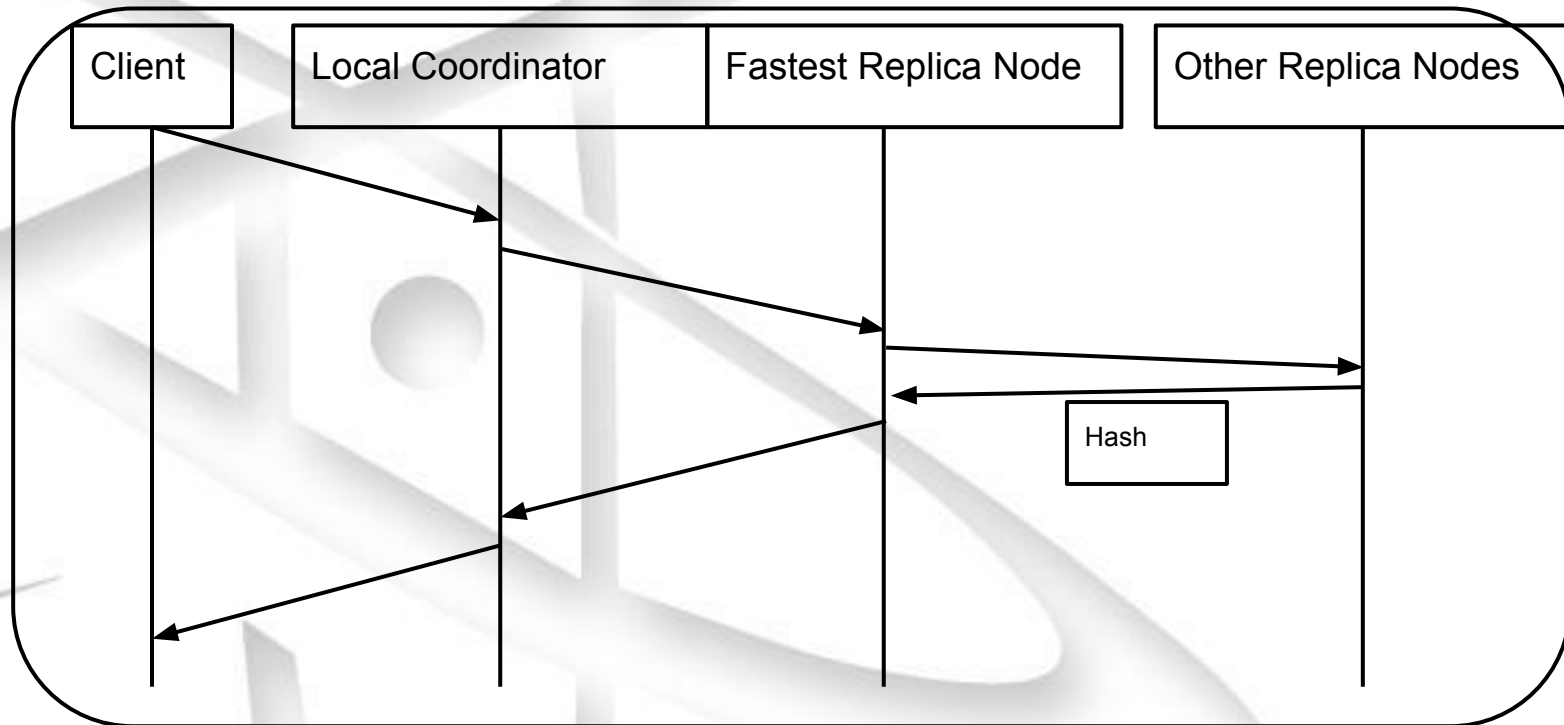
Adapted from <https://wiki.apache.org/cassandra/WritePathForUsers>



# Background

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## Read Path - Nominal



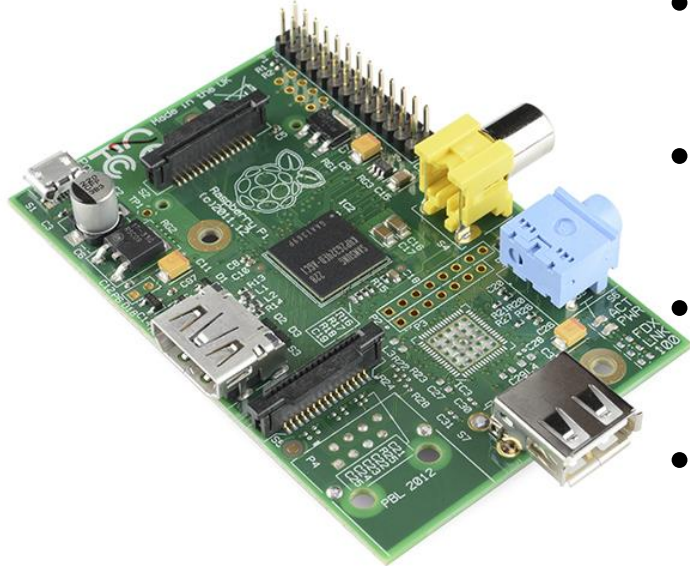
Adapted from <http://wiki.apache.org/cassandra/ReadPathForUsers>



# Raspberry Pi Series



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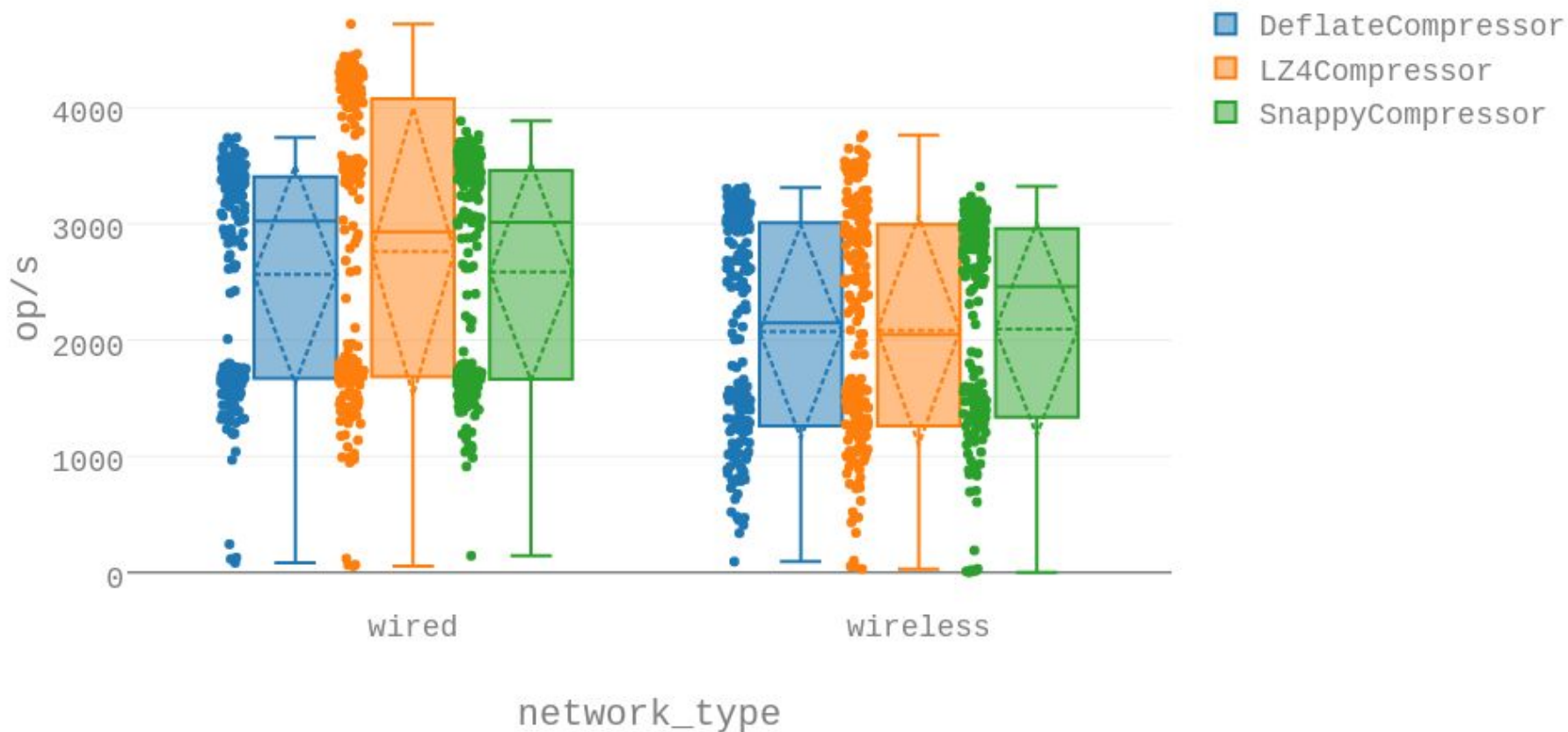
- Multiple Models: 0, 1, 2, 3; A, B, +
- ARM Processor
- 1 GB RAM
- Designed for education
- Website  
<https://www.raspberrypi.org/help/>
- Example image courtesy of [https://en.wikipedia.org/wiki/Raspberry\\_Pi](https://en.wikipedia.org/wiki/Raspberry_Pi)



# cassandra-stress

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Operations Per Second - Reads Only







# Experimental Setup



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Workload	Read	Update	Scan	Insert
A	0.50	0.50	0.00	0.00
C	1.00	0.00	0.00	0.00
E	0.00	0.00	0.95	0.05
I	0.01	0.00	0.00	0.99

Communication	Platform	RAM
Nodal	Virtual Machine	1 GB
Nodal	Virtual Machine	2 GB
Nodal	Virtual Machine	4 GB
Ethernet LAN	Raspberry Pi	1 GB
802.11 LAN	Raspberry Pi	1 GB

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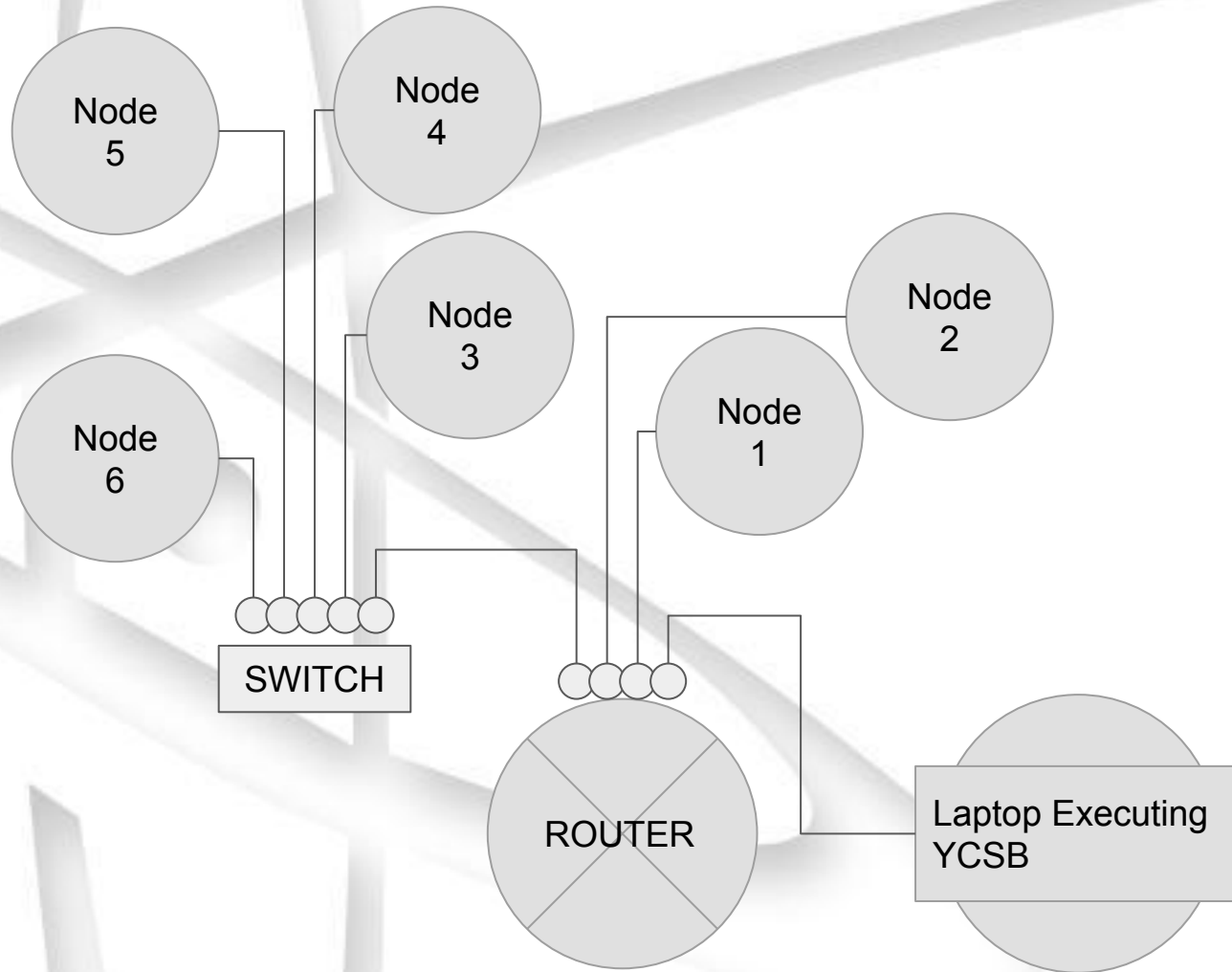
*Aim High...Fly - Fight - Win*





# Experimental Setup (cont)

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# Experimental Results

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Execution Time, Workload A





# Linear Regression (A)

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Cluster Size (nodes)	Slope (ms per GB RAM)	Intercept (ms)	r-Value	p-Value	Standard Error
1	-68.8	6.45e+03	-0.509	2.08e-05	14.9
3	120	1.01e+04	0.458	0.000162	29.9
6	147	1.43e+04	0.514	1.67e-05	31.5



# Experimental Results

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Execution Time, Workload C



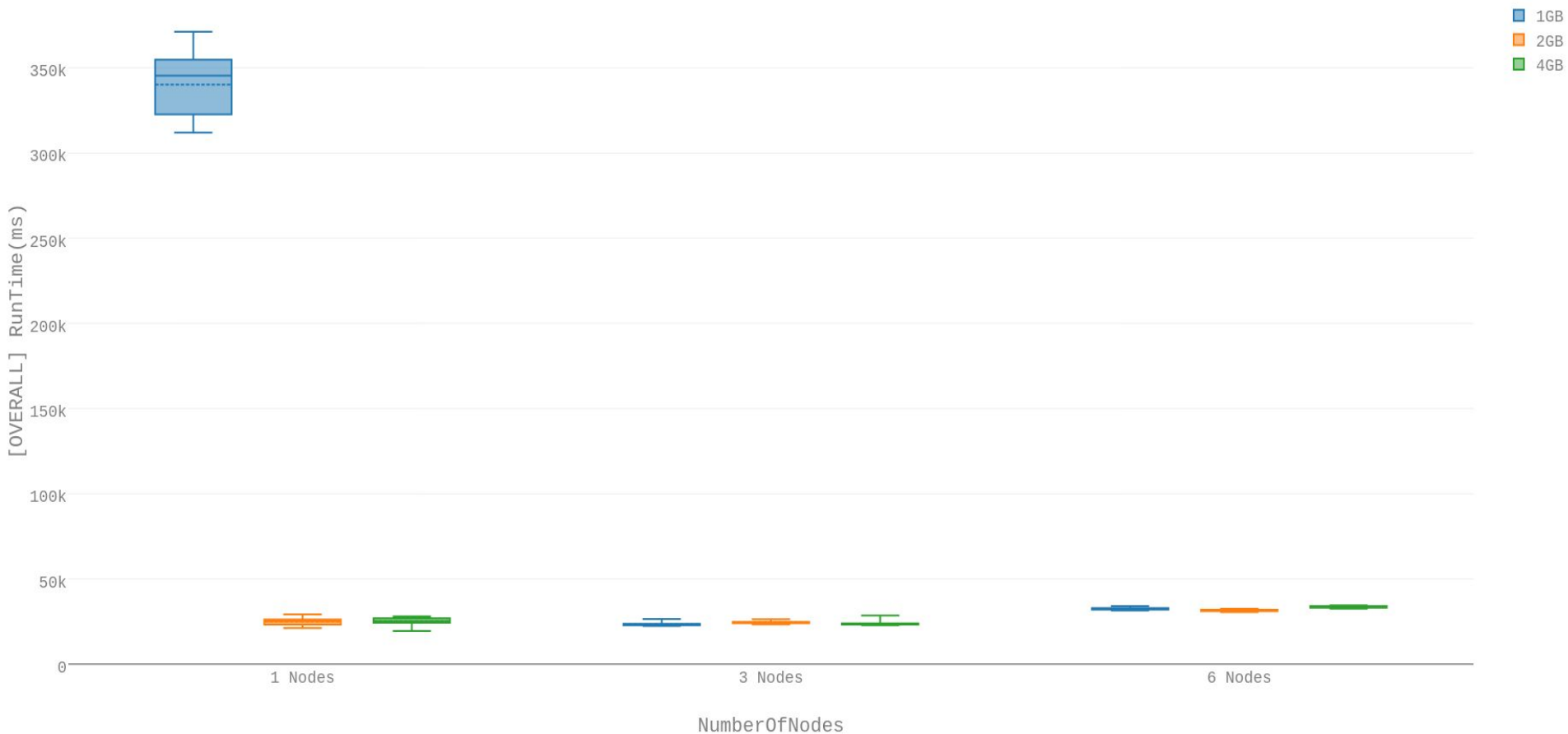


# Experimental Results



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Execution Time, Workload E

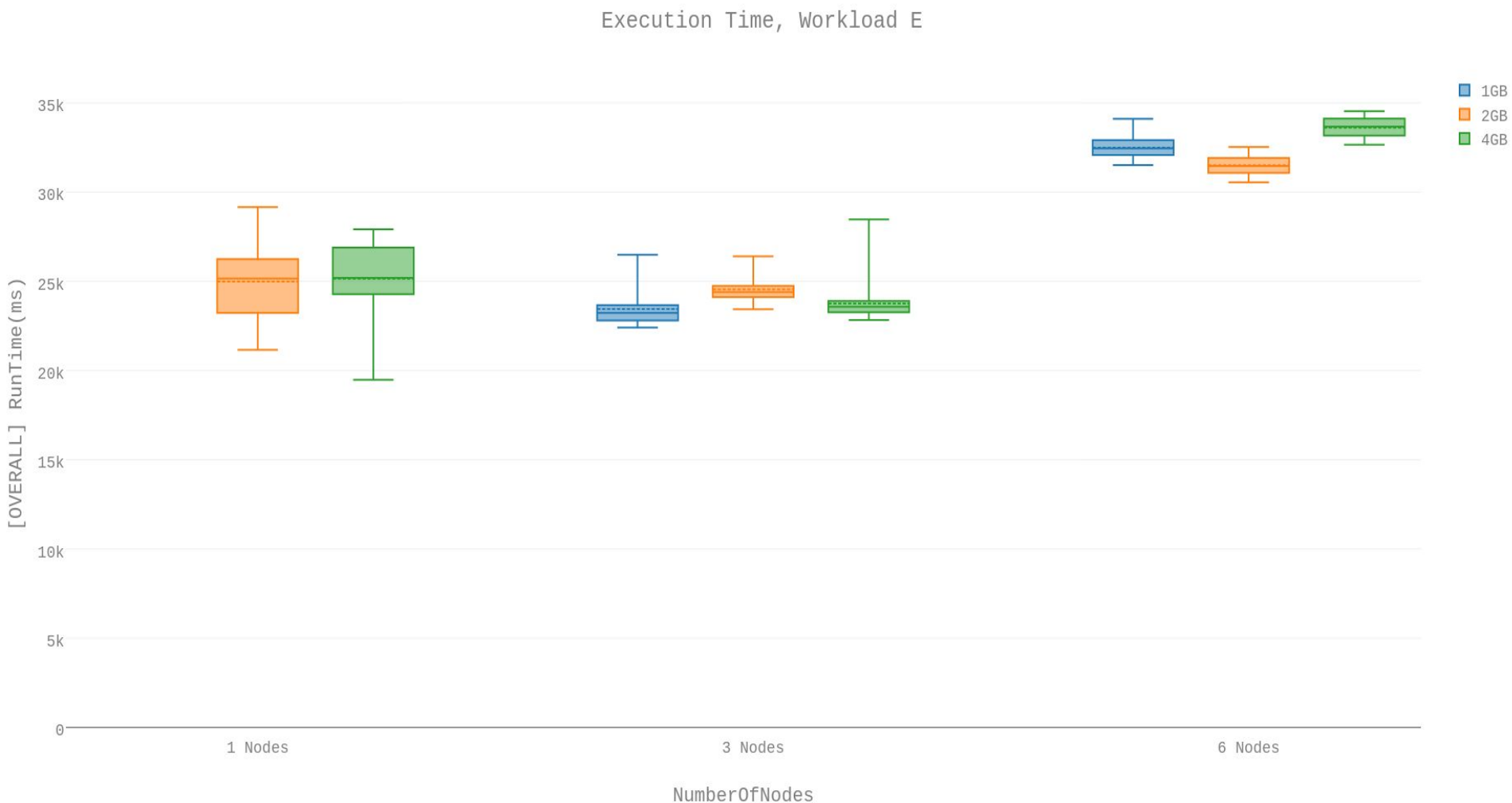




# Experimental Results



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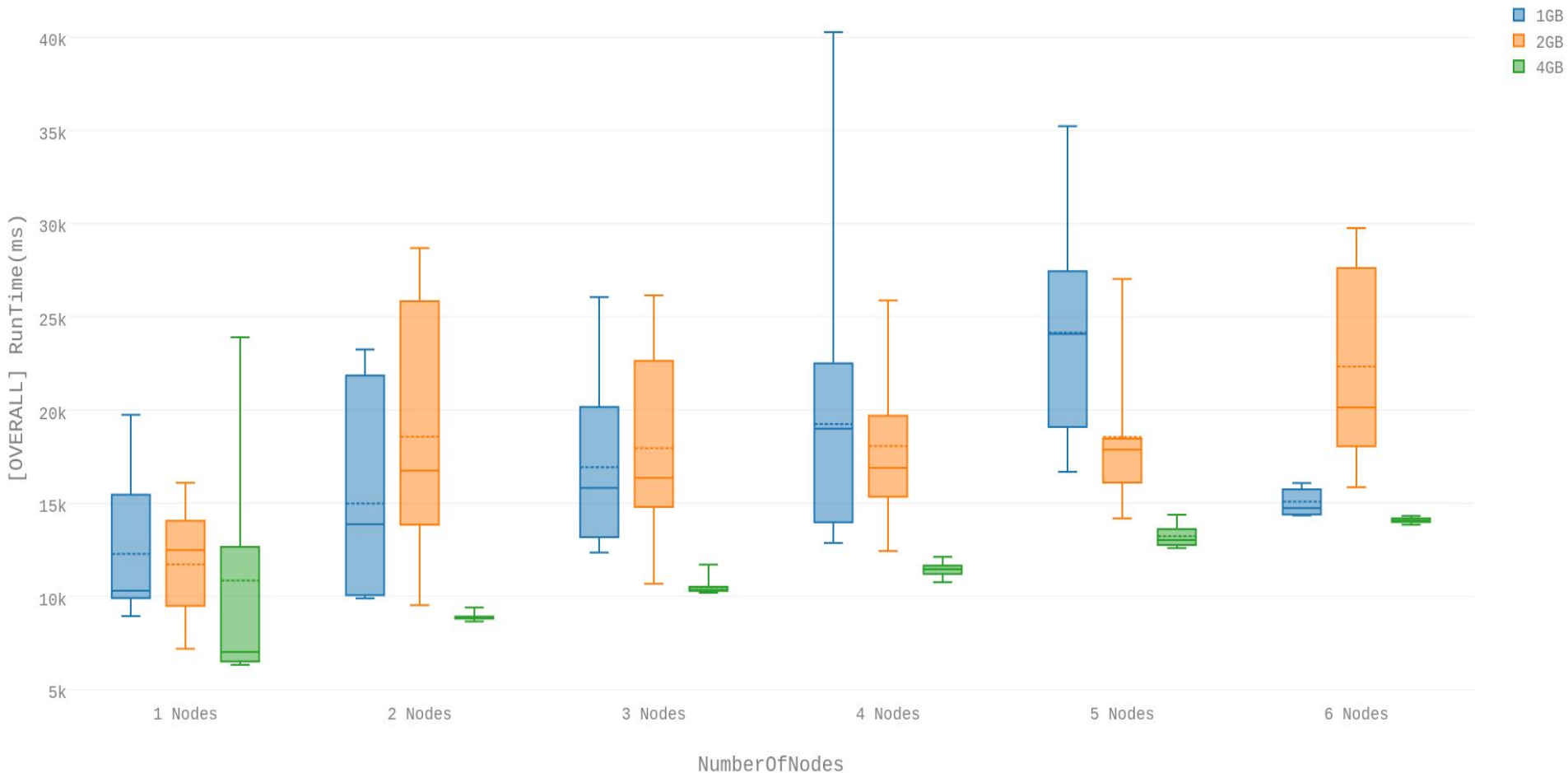




# Experimental Results

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Execution Time, Workload I





# Experimental Results



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- These results fail to suggest a linear prediction of performance based on RAM.

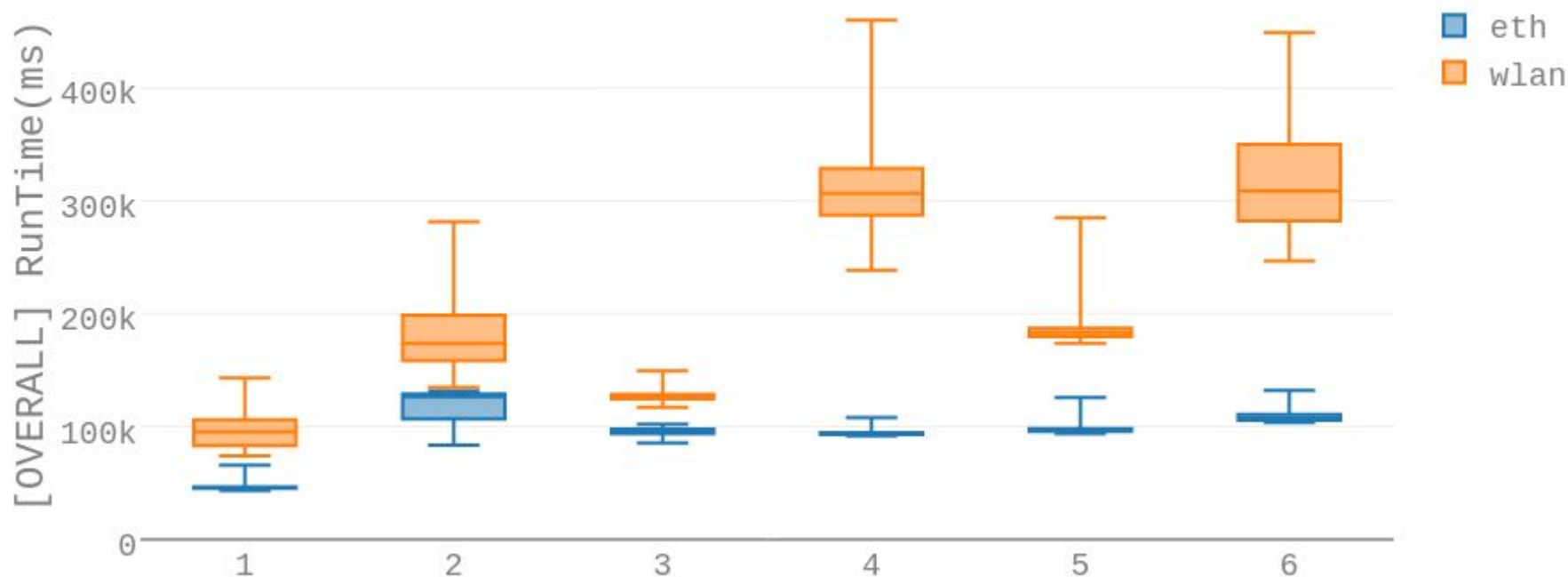




# Experimental Results

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Execution Time, Workload A



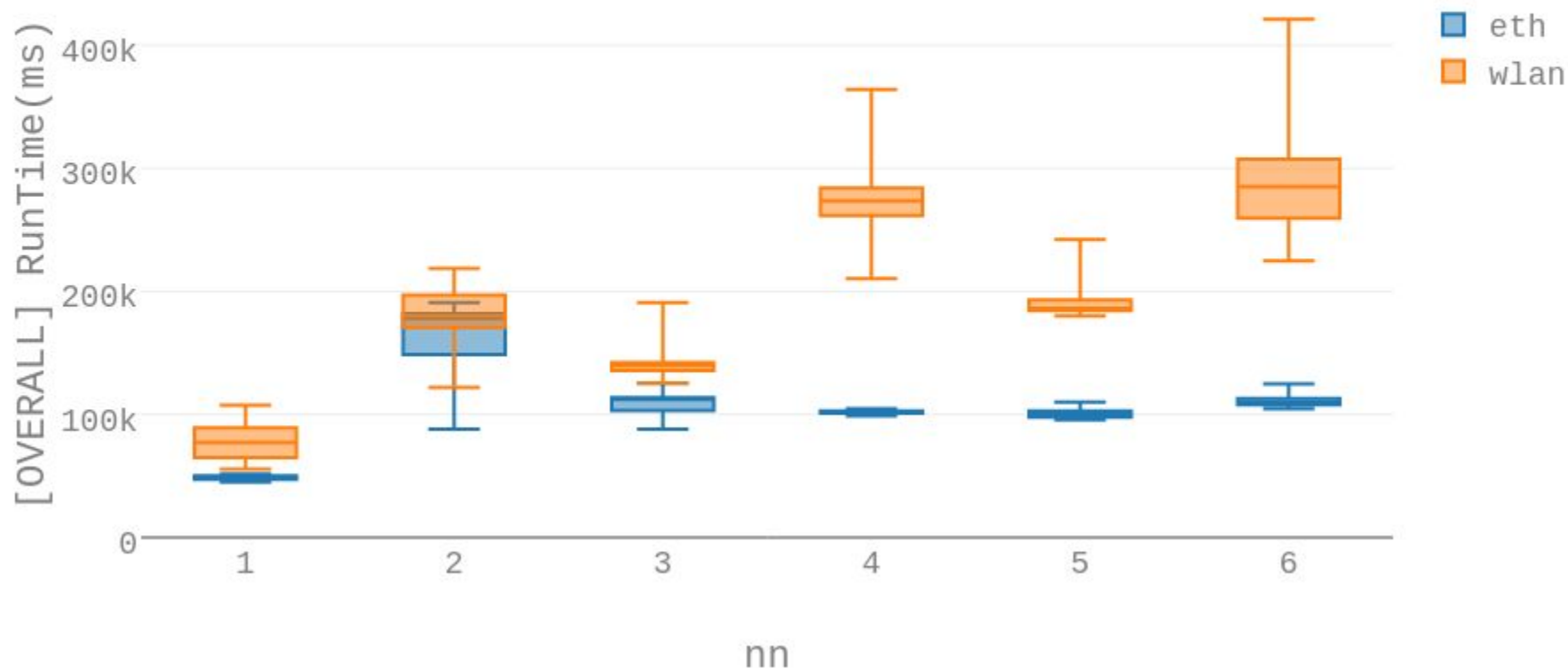
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# Experimental Results

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Execution Time, Workload C

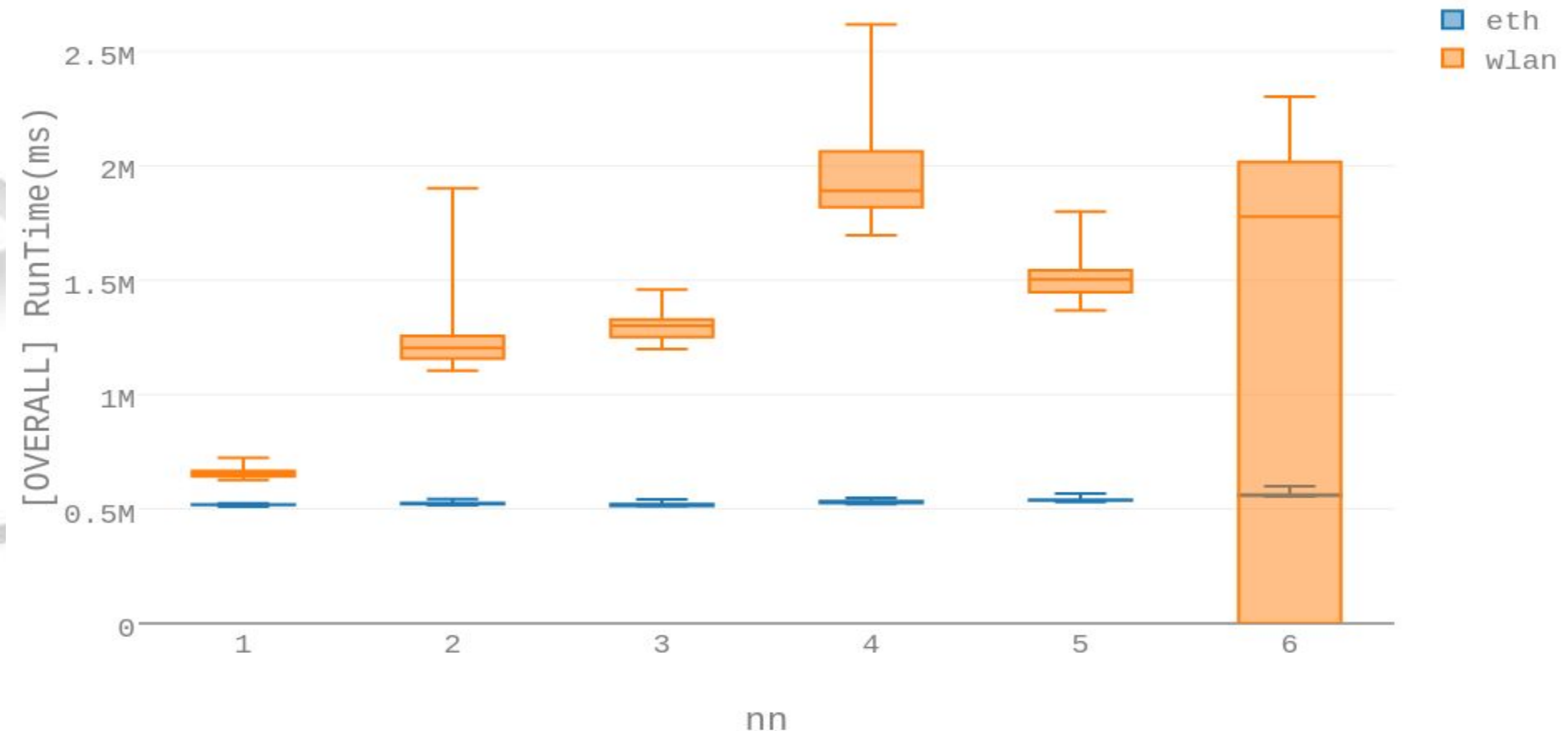




# Experimental Results

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Execution Time, Workload E

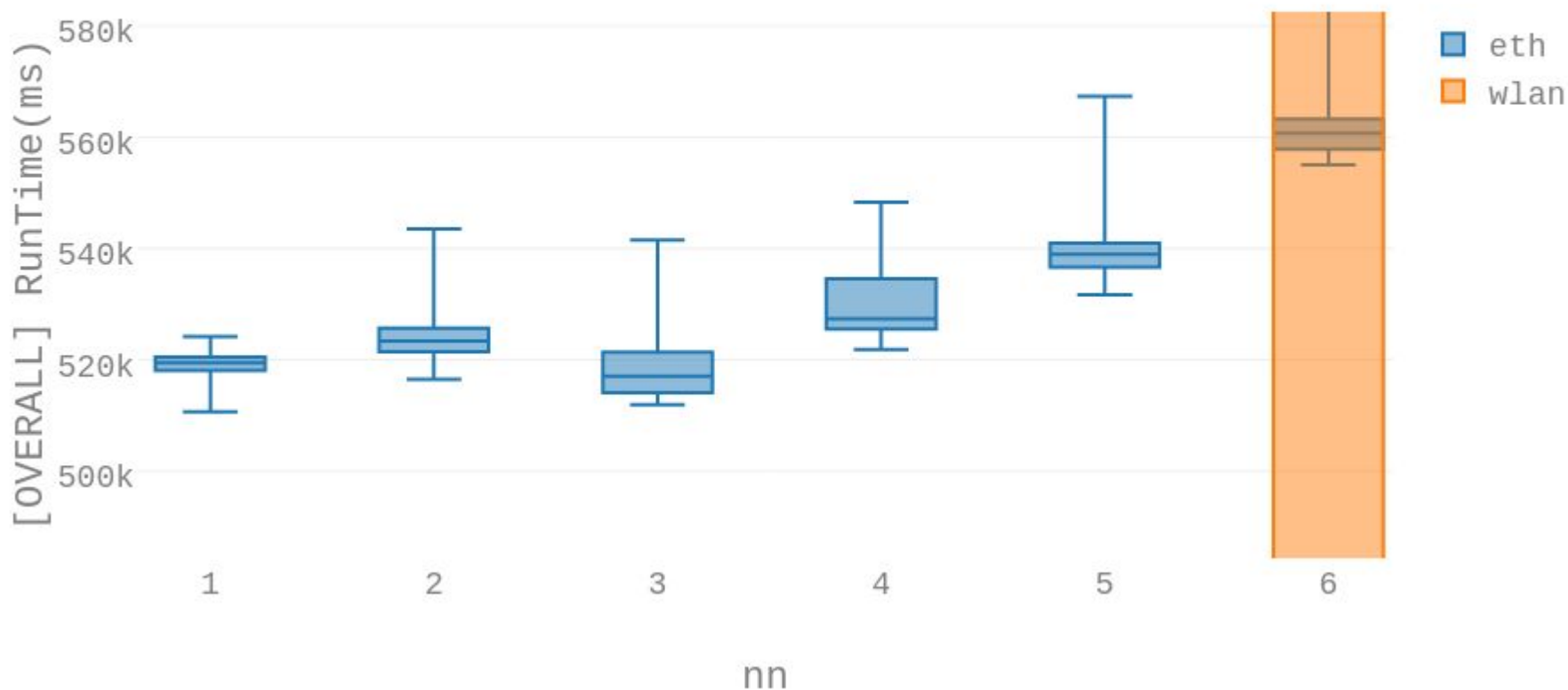




# Experimental Results

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Execution Time, Workload E

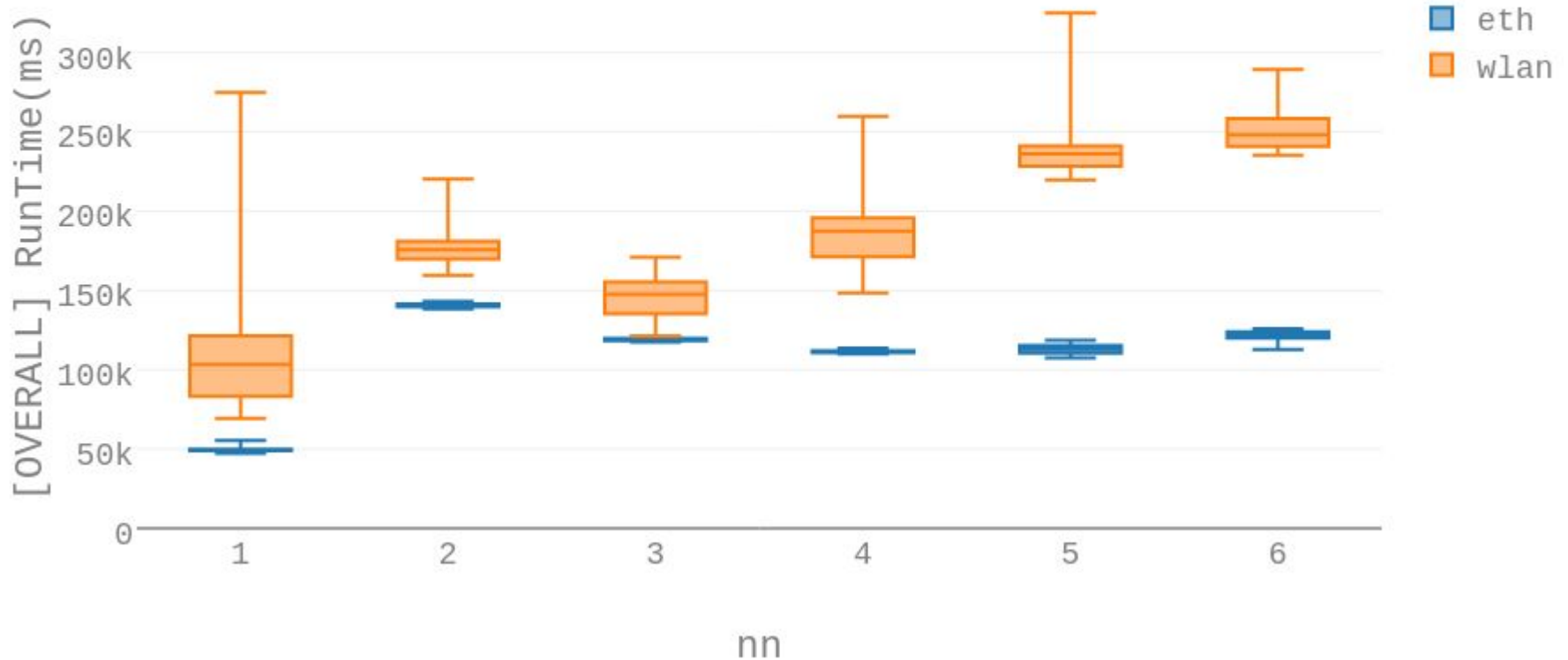




# Experimental Results

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Execution Time, Workload I





# Experimental Results



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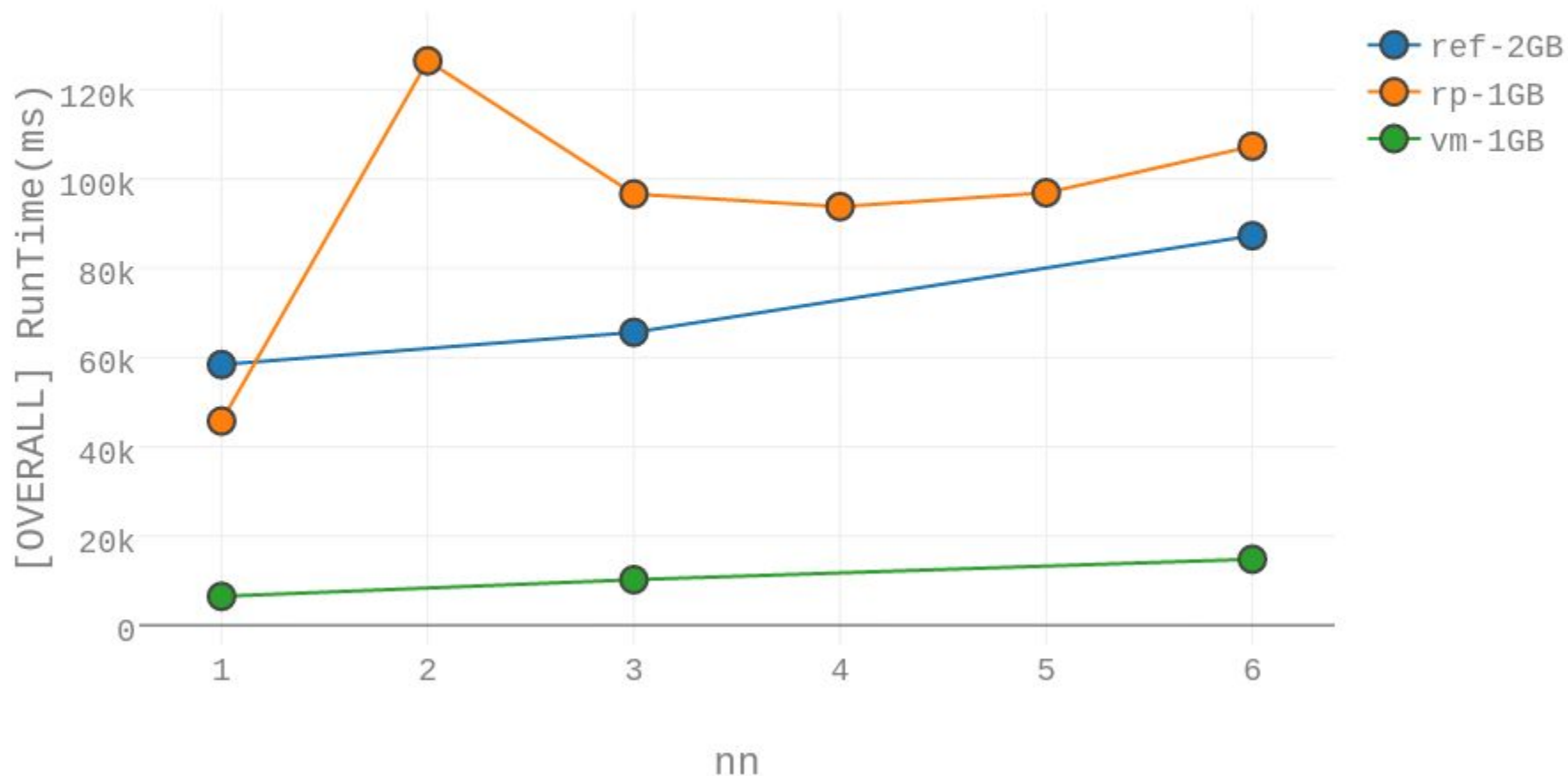
- These results seem to suggest Cassandra's scalability may be a bit threatened by wireless. Additional testing may be of value to see if this trend continues or if something could ameliorate it, such as employing the request-to-send.



# Experimental Results

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Execution Time, Workload A

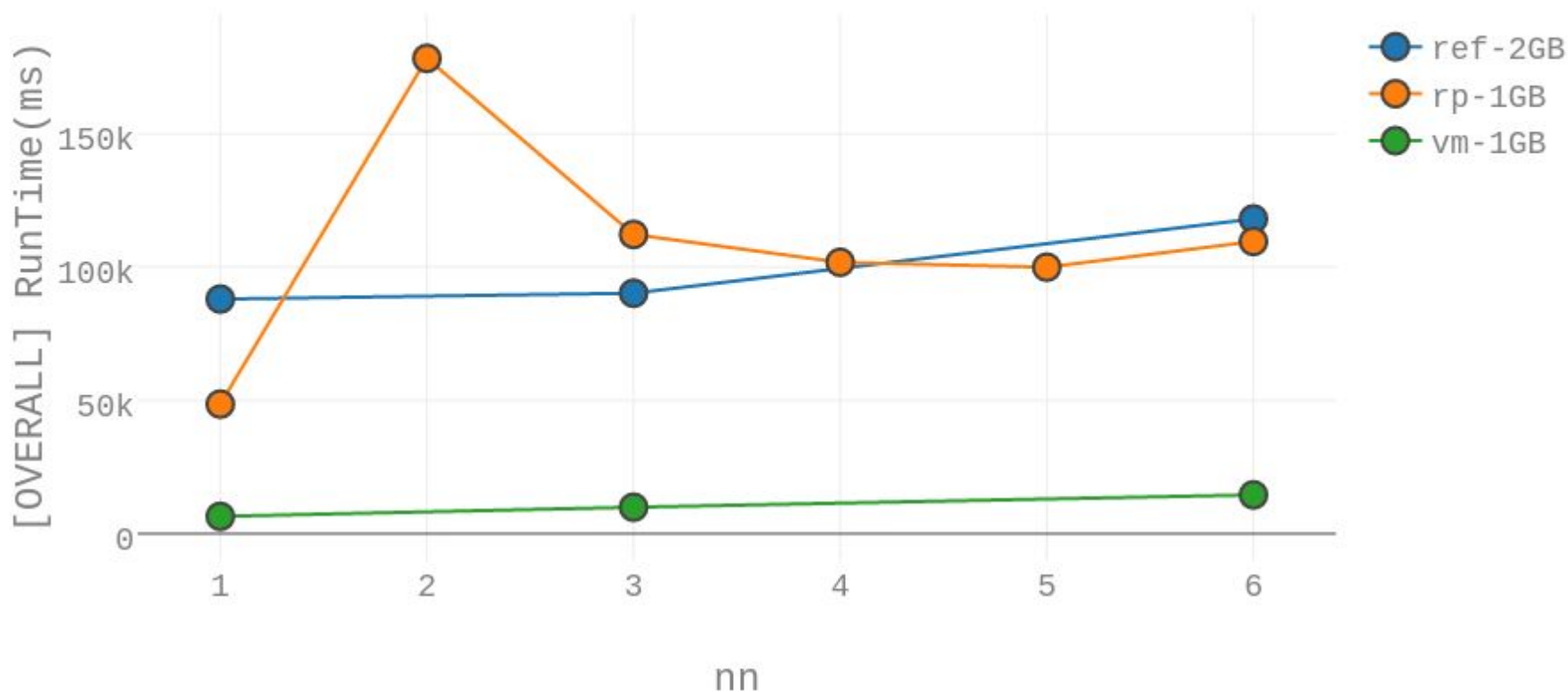




# Experimental Results

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Execution Time, Workload C



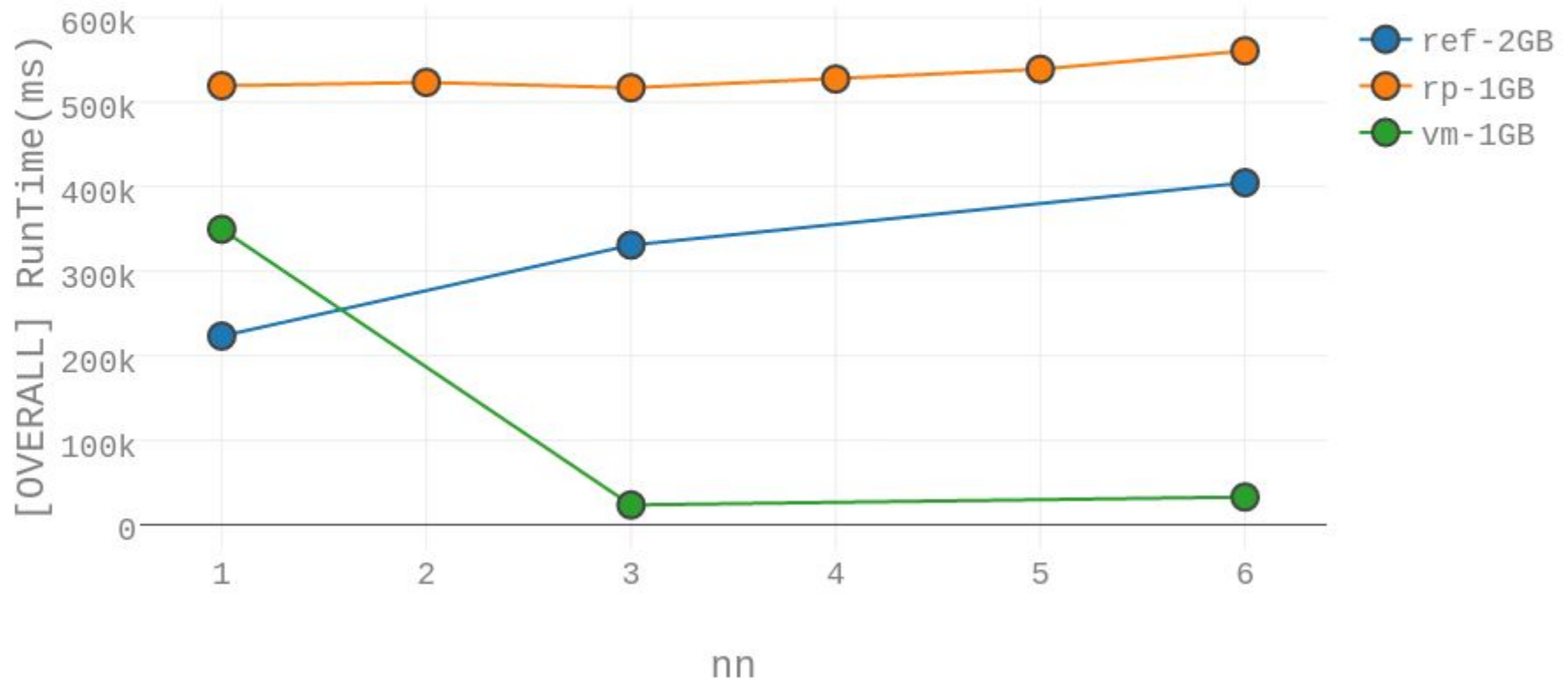




# Experimental Results

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Execution Time, Workload E

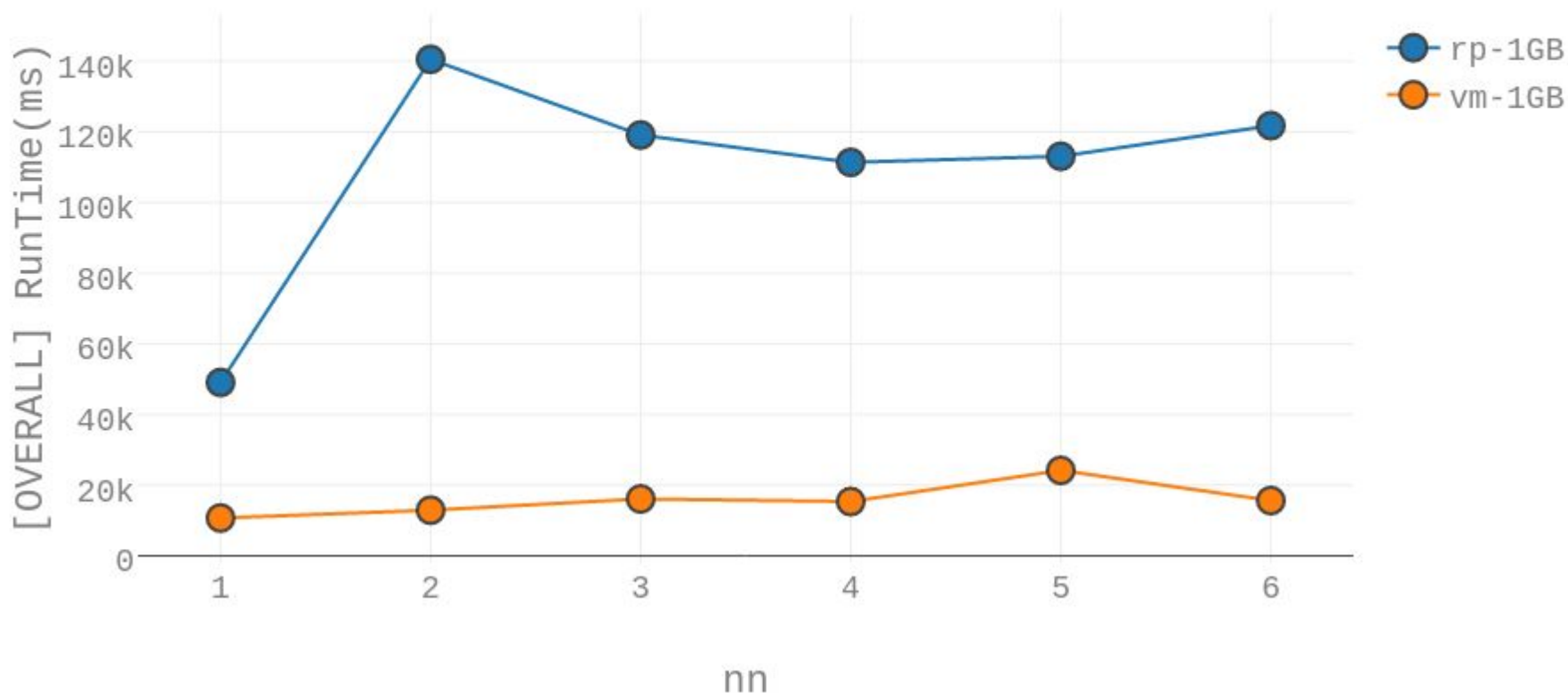




# Experimental Results

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Execution Time, Workload I





# Absolute Differentials

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<b>Number of Nodes</b>	<b>1-Node Cluster</b>	<b>3-Node Cluster</b>	<b>6-Node Cluster</b>	<b>OVERALL</b>
<b>Count</b>	21	21	21	63
<b>Mean (ms)</b>	1.28e+04	3.16e+04	1.95e+04	2.13e+04
<b>Standard Deviation (ms)</b>	1.12e+03	1.65e+03	1.78e+03	7.96e+03
<b>Minimum (ms)</b>	1.03e+04	2.81e+04	1.64e+04	1.03e+04
<b>25% (ms)</b>	1.23e+04	3.07e+04	1.83e+04	1.35e+04
<b>Median (ms)</b>	1.28e+04	3.14e+04	1.94e+04	1.94e+04
<b>75% (ms)</b>	1.35e+04	3.22e+04	2.02e+04	3.06e+04
<b>Maximum (ms)</b>	1.52e+04	3.49e+04	2.37e+04	3.49e+04



# Conclusions



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- Available RAM
  - Results and interpretation fail to suggest any utilitarian linear model of performance.
- Workload
  - Results suggest that workload can make a difference in performance, and such differences were accentuated with hardware changes.
- Scalability
  - Results suggest reasonable scalability of wired and virtual clusters over cluster size... wireless less so and results suggest the utility of additional experimentation.
- Raspberry Pis versus Virtual Machines
  - Results suggest confirmation of a cost in execution time.
  - Results also suggest more experimentation could lead to a correction factor for simulated applications.



# Future Work



*The AFIT of Today is the Air Force of Tomorrow.*

- Varying Database Size
- Wireless Configurations (request-to-send, maximum transmission unit)
- Varying Hardware, not just the Raspberry Pi
- Testing Larger Clusters
- Varying Thread Count



# Future Work



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- WiFiPi Prototype
  - Sniff traffic with scapy
  - Filter out probe requests
  - Extract SSIDs (plaintext), IP Addresses
  - Append to Distributed Database



# Sources



***The AFIT of Today is the Air Force of Tomorrow.***

- [1] Cooper, B. F., Silberstein, A., Tam, E., Ramakrishnan, R., & Sears, R. (2010). *Benchmarking cloud serving systems with YCSB. Proceedings of the 1st ACM Symposium on Cloud Computing - SoCC '10*, 143–154.  
<http://doi.org/10.1145/1807128.1807152>
- [2] Abramova, V., Bernardino, J., & Furtado, P. (2014). *Testing Cloud Benchmark Scalability with Cassandra. 2014 IEEE World Congress on Services*, 434–441. <http://doi.org/10.1109/SERVICES.2014.81>
- [3] Waddington, D. G., & Lin, C. (2016). *A Fast Lightweight Time-Series Store for IoT Data*.
- [4] Lourenco, J. R., Abramova, V., Cabral, B., Bernardino, J., Carreiro, P., & Vieira, M. (2015). No SQL in Practice: A Write-Heavy Enterprise Application. *Proceedings - 2015 IEEE International Congress on Big Data, BigData Congress 2015*, 584–591.  
<http://doi.org/10.1109/BigDataCongress.2015.90>
- [5] Abramova, V., & Bernardino, J. (2013). NoSQL databases: MongoDB vs cassandra. *Proceedings of the International C\* Conference on Computer Science and Software Engineering, ACM 2013*, 14–22. <http://doi.org/10.1145/2494444.2494447>



# End



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