

# **AppEKG: A Simple Unifying View of HPC Applications in Production**

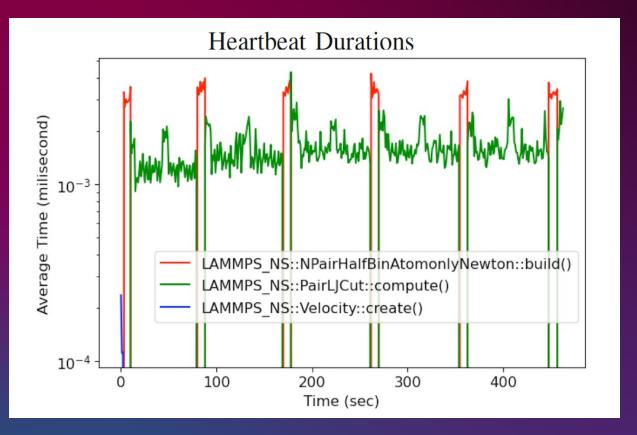
Authors

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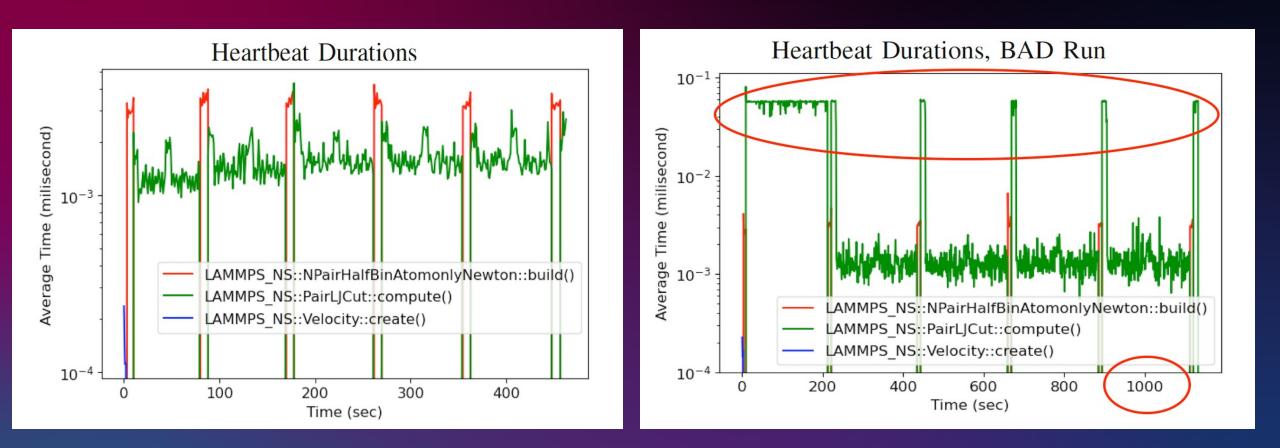
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### LAMMPS Heartbeats Data



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## AppEKG: A Heartbeat Framework

- The main goal of this research is to observe the application performance in production at the phase level.
- AppEKG collects heartbeat data (counts and average durations) from the representative phases.
- AppEKG writes out heartbeat data per process (rank) and per thread.
- Collected heartbeat data can be used to analyze and understand application performance in production.



### **APPEKG Macro Interface**

**EKG\_BEGIN\_HEARTBEAT(id, rateFactor) EKG\_END\_HEARTBEAT(id)** EKG\_PULSE\_HEARTBEAT(id, rateFactor) **EKG\_INITIALIZE(numHeartbeats, samplingInterval, appid, jobid, rank, silent)** EKG\_FINALIZE() EKG\_DISABLE() EKG\_ENABLE() EKG\_NAME\_HEARTBEAT(id, name) EKG\_IDOF\_HEARTBEAT(name) EKG\_NAMEOF\_HEARTBEAT(id)

## **Controlling Overhead: Sampling Interval**

- AppeKG must limit I/O in order to control overhead.
- AppEKG accumulates heartbeat data internally over a pre-defined interval.
- Only writes out heartbeat counts and average durations per interval.
- The sampled data still captures the dynamic behavior of the applications.

### **Controlling Overhead: Rate Factor**

- Instrumenting a piece of code that has a high execution rate may produce high overhead.
- To control such overhead, a per-heartbeat rate factor is used to limit how often a heartbeat is produced.
- Implemented in the macro interface to avoid function call overhead.

#define EKG\_BEGIN\_HEARTBEAT(id, rateFactor)
...
if ((\_ekgHBCount[tid]++) % (rateFactor) == 0) {
 \_ekgBeginHeartbeat((id));

## AppEKG vs Caliper

- AppEKG and Caliper instrumentation overheads for three instrumented applications.
- APPEKG overhead is near to 1%.
- Caliper reports low overhead with simple reporting, but extremely high overhead with more detailed reporting.

#### APPEKG AND CALIPER OVERHEADS.

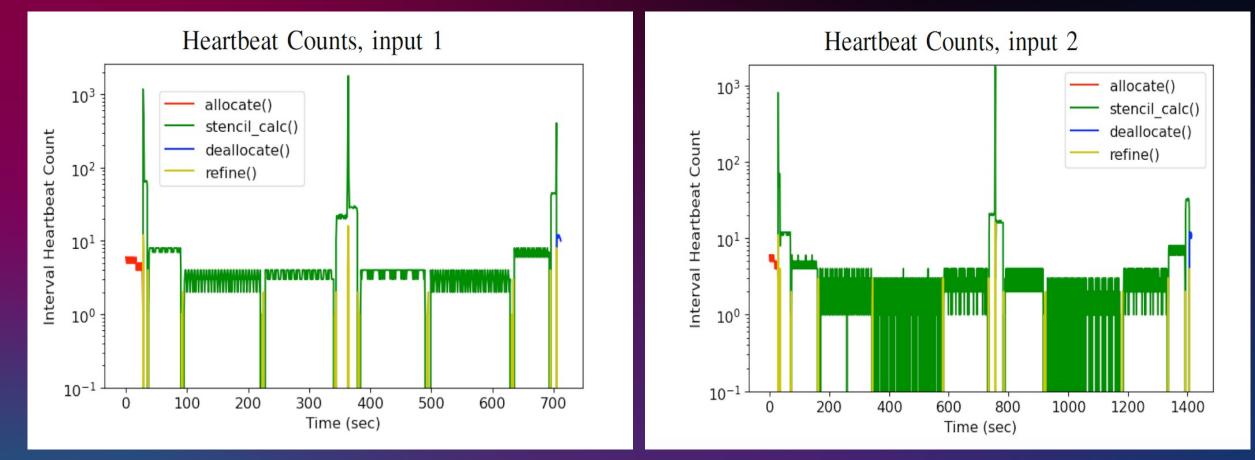
|         | Uninst |          | Max    |                  |           |
|---------|--------|----------|--------|------------------|-----------|
|         | time   | AppEKG   | Rate   | Caliper Overhead |           |
| App     | (sec)  | overhead | Factor | Summary          | Detailed  |
| LAMMPS  | 462    | 0.60%    | 500K   | <1%              | 400-1200% |
| MiniAMR | 720    | 0.55%    | 100    | $\sim 1\%$       | n/a       |
| MiniFE  | 844    | 1.18%    | 2M     | <1%              | 40-350%   |

### Heartbeat Analyses

- AppEKG is still in very early exploratory development, we do not have large and sophisticated heartbeat analyses developed.
- AppEKG can be used to create historical heartbeat data of applications that can be utilized to build a ML module to:

> Detect anomalous future runs that deviate from the normal pattern.

## Example1: Heartbeat Data Presentations (Visual) MiniAMR



# Example2: Heartbeat Data Presentations (Statistical) MiniAMR

- Descriptive statistics for each heartbeat counts of all processes.
- Such statistics can be also generated per process and per thread.
- Analyze the variance between processes or threads.

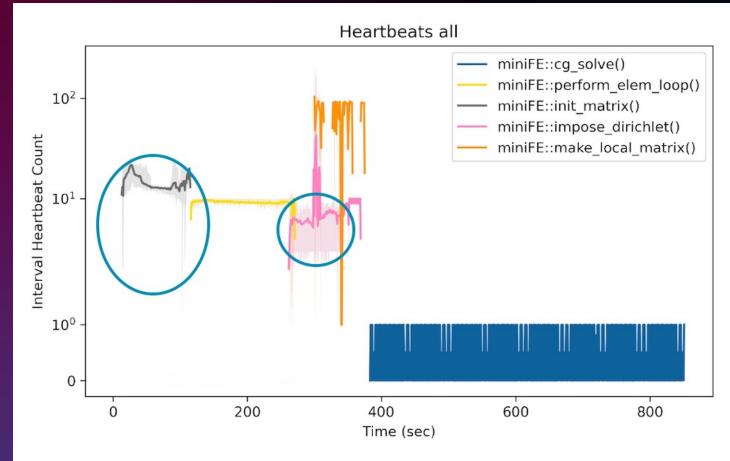
### FULL EXECUTION MINIAMR HEARTBEAT DESCRIPTIVE STATISTICS

| HB | Min | Max  | Mean | SDev | Skew | Kurtosis |
|----|-----|------|------|------|------|----------|
| 1  | 1   | 6    | 4.8  | 0.90 | -0.5 | 5.3      |
| 2  | 1   | 1780 | 12.4 | 78.3 | 0.3  | 219      |
| 3  | 3   | 12   | 10.7 | 1.6  | -0.5 | 4.0      |
| 4  | 1   | 16   | 3.2  | 3.7  | 1.0  | 2.7      |



## Example3: Heartbeat Data Presentations (Statistical) MiniFE

- Lines are all-processes average heartbeat count.
- Min/Max values form the shaded area around the average line.
- Min and Max values are extremely close to the average value.



### Conclusion

- AppEKG is a novel approach to providing better insight into how HPC applications behave in production.
- It collects heartbeat data from most representative application phases.
- The main goal of AppEKG is to evaluating application performance in production.
- Many possible uses for heartbeat data we are exploring some, would like to see others do so as well!

## Thank You!



https://github.com/NMSU-PLEASE-Lab/AppEKG

