# **Continuous Distributed Monitoring in the Evolved Packet Core**

Industry Experience Report

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# Introduction

# Context: Monitoring the Evolved Packet Core (EPC) in 4G



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- Large-Scale, Distributed, Performance-critical system.
- Strong need to continuously monitor the EPC: e.g. detection of under- or over-used subcomponents.

# **Continuous Distributed Monitoring**







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# **System Architecture**











#### Differences with CDM models

- Sites identity matters, performance statistics  $\neq$  "events", etc
- Need to account for comp. and communication delays!













 $\rightarrow$  At the Agg: monitoring decisions then 1 monitoring message.

# **Monitoring Algorithms**

# Selected CDM Algorithms for Counting problems

#### **Basic Mode: Exact Monitoring**

- Send an update if *last value sent* is different to measured value
- Keep an exact sliding window of the last *n* values



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## Approximation Mode: Relative Error of $\boldsymbol{\varepsilon}$

- Uses Exponential Histograms for approximate counting
- Send the *approximate count* when it is beyond some error bound from the last value sent
- Requires in all  $\mathcal{O}(\log(n\varepsilon)/\varepsilon)$  words



# Results

# **Experimental setup**

- EPG setup: 2 aggregators, 72 workers per aggregator
- 2 phases: increasing load (20min) then stable load (15min)



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# **Monitoring Availability**

• 8 runs (ca 4h of data) with monitoring round = 1s



# Conclusion

- Adjusted state-of-the-art CDM implementations in the EPC
- Keys to popularize CDM within a production level system
- From experiments, only 6% of data sent for 1.6% avg error
- Useful for the upcoming transition to 5G architecture

# Thank you!

# **Error Analysis**

- Max relative error is always close to  $\frac{5\varepsilon}{9}$
- Larger window influences absolute error on CPU



# **Comparison with Simple Approximation**

• Simple Approximation: keep an exact window and send updates when last count is beyond some predefined relative bound



ε-Approximate algorithm presents similar tradeoffs as the simple approximation with bound <sup>5ε</sup>/<sub>9</sub>

# Simple approaches

- Flooding, do not scale!
- Polling, but hard to choose right polling interval!
- Sampling, do not capture scarce under/over-used components!

# Solutions

- Communication-optimal algorithms
- Geometric Monitoring  $\rightarrow$  efficient network-wide aggregate.
- Tailored algorithms for particular tasks  $\rightarrow$  e.g. computing the frequency of items or most popular ones.
- Heuristics  $\rightarrow$  e.g. adaptive filters.
- Compromises: Magpie, Dapper, Ganglia...

# Monitoring Period Fetches Sliding Window

# Monitoring Logic for each monitored value

- Implemented as part of the aggregator nodes
- once all fetched have been collected, a monitoring decision is taken upon propagating the update
- Aggregation of all monitoring updates: sending of (up to) a single monitoring message per aggregator

# Selected CDM Algorithms

## Basic Mode

- Send an update if last value sent is different
- Keep an exact sliding window of length n

## $\varepsilon$ -Approximation Mode

- Maintains an <sup>ε</sup>/<sub>9</sub>-approximate Exponential Histogram for counting approximate sum ĉ of items over a sliding window of the last n events
- Whenever  $\hat{c} > (1 + \frac{4\varepsilon}{9})c$  or  $\hat{c} < (1 \frac{4\varepsilon}{9})c$ , send an update, where c is the last value sent
- Requires in all  $\mathcal{O}(\log(n\varepsilon)/\varepsilon)$  words of memory

# Measuring Metrics of Interests: 2 modes

# With high granularity: CPU usage

- 1. *P* fetches of CPU-usage for past 1ms each within one monitoring period
- 2. Frequency chart (histogram of F bins) for the P fetches
- 3. Sliding Windows are updated: each bin is monitored
- 4. For each changed (basic) or outside of bounds (approx) value, a monitoring update is sent
- 5. Upon receiving an update: *C* updates its frequency counts for the resp. observer and CPU-bin and then may display the average CPU over the window as  $\sum_{1 \le i \le F} if_i / \sum_{1 \le i \le F} f_i$

#### With low granularity: Packet Processing Rate

• Only the no. of processed packets per mon. period is tracked