

# Multi-level, Multi-core Distributed Trace Synchronization



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#### **Outline**

- Introduction
- Online Synchronization Approaches
- Results
- Conclusion
- References

# **Streaming Data Challenges**

- Synchronizing a live trace stream on the fly.
  - It is not practical to scan the data stream more than once
  - Buffering the data stream for a long period is problematic

- Goal 1: Online time synchronization of distributed traces has to be efficient in both time and memory
- **Goal 2:** Prevent reading the whole data from the start point of tracing to the end of the current time
- **Goal 3:** Online time synchronization has to be scalable and should not lose the accuracy over time

## Time Window based approaches

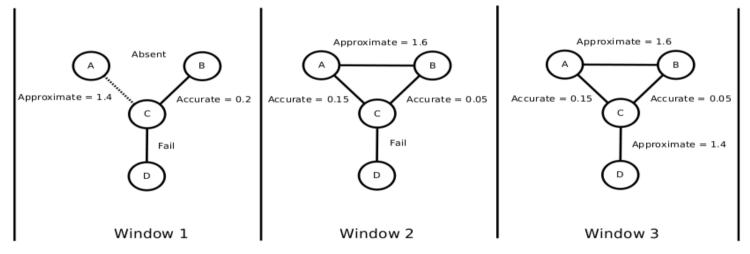
- Independent
- Replace
- Merge (10%, 50%, and 90%)
- Correlated

# **Independent Approach**

- Analyze one time window at a time, independently
- Advantages:
  - No buffering or dependency on data from previous time windows.
  - Simpler and more efficient compared with the three other approaches
- Disadvantages:
  - It is not able to achieve a satisfactory accuracy, not only in each window, but also after a settling period.

## Replacement Approach

- Using the useful results from convex-hulls of previous windows
- This approach insures accuracy improvement over time but the rate of improvement is slow



For each link d = Accuracy(i-1) - Accuracy(i) if d > Threshold replace else

drop current result

# **Merging Approach**

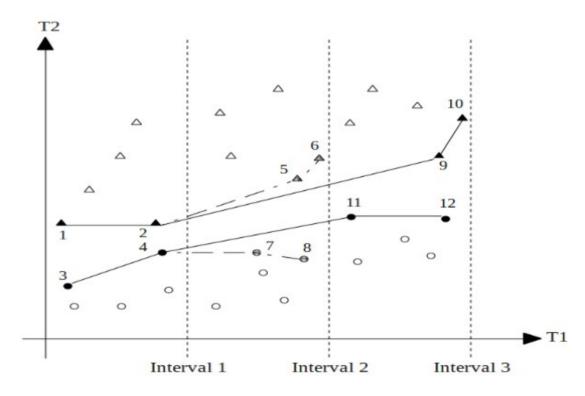
Merging the synchronization results of current window and previous window

$$Accuracy(i) = k * Accuracy(i-1) + (1-k) * a(i)$$

- a(i): the output of the Convex-hull algorithm for window i
- k: the weighting factor
- Different approaches can be defined based on k value:
  - Merge 10 (K = 10)
  - Merge 50 (K = 50)
  - Merge 90 (K = 90)

## **Correlated Approach**

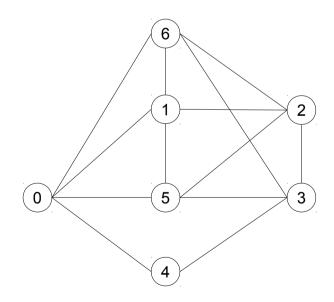
 Select the accurate packets in each window and transfer them to the next window



Correlated Sliding Window

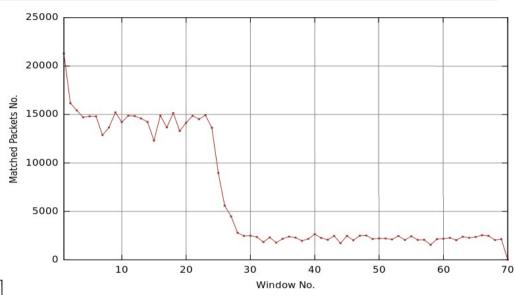
# **Cluster Setup**

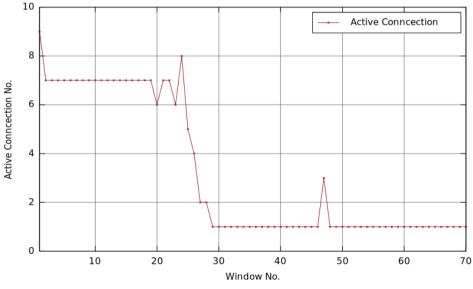
- Synchronisation of 7 nodes
- Each node is a Pentium III (4 CPUs) with 4 GB of RAM
- Window size is 3 seconds
- The nodes relationship graph:



#### Test Results (1)

• Total input and output events matched together to form a packet in each window

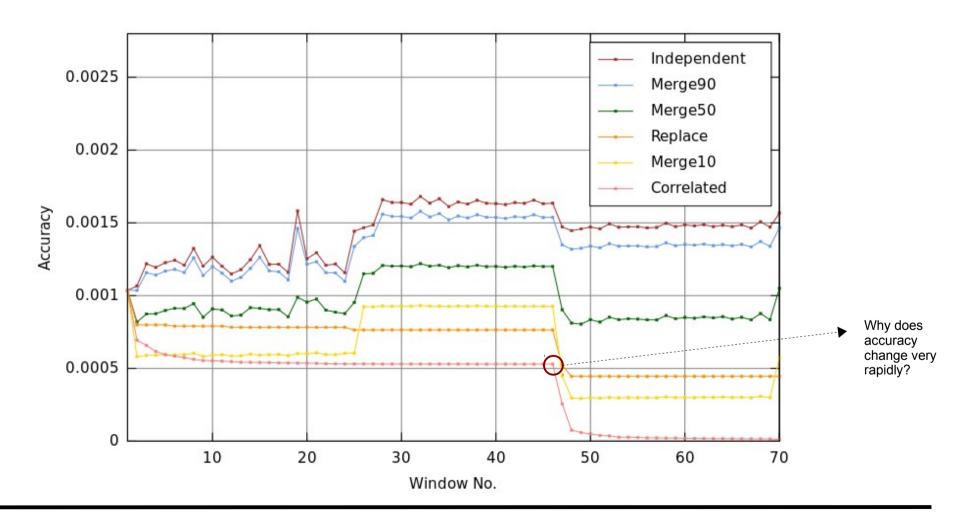




• The number of active connections in each window

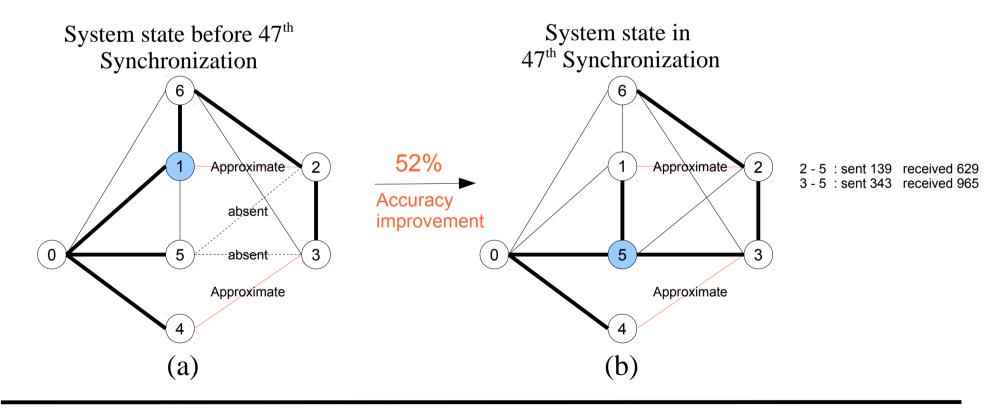
#### Test Results (2)

• The best approach is correlated sliding window



#### Test Results (3)

- From window 1 to window 46, Node 1 is reference node
- From window 47 to window 70, Node 5 is reference node

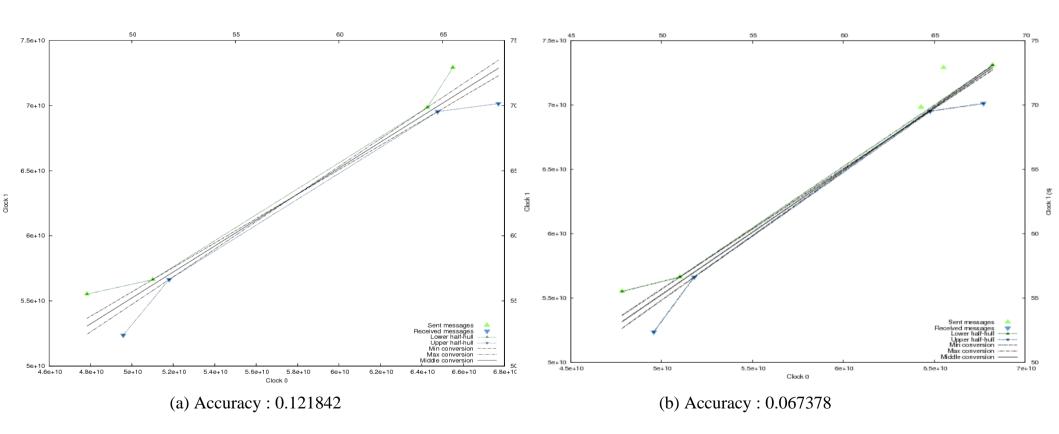


# **Question?**

Is there any way to improve the correlated sliding window technique?

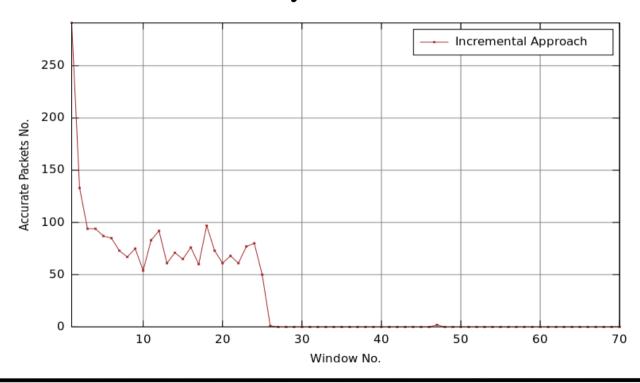
#### **Incremental approach (1)**

- The lowest distance to the middle line is the best accurate packet
- Accurate packets improve accuracy



# **Incremental approach (2)**

- There are many accurate packets between window 1 and 26 because there are many active connections
- If we recompute the synchronization each time an accurate packet is received, it increases the analysis time

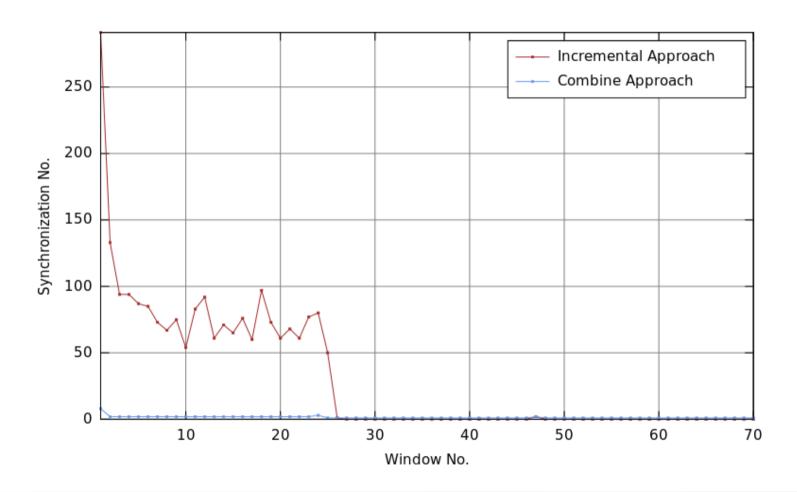


## **Incremental approach (3)**

- Criteria to manage the accurate packets
  - Add window technique
  - Each link has <u>a chance</u> to activate time synchronization in each window
  - Synchronizing at the end of window if we were not triggered by an accurate packet
    - Sometimes a packet does not have minimum distance to the conversion functions but removes some packets on upper or lower hull (*interesting packet*)
    - Interesting packets improve accuracy a little
    - There is a trade off between the <u>cost of synchronization</u> and the accuracy increase we get with an interesting packet

# **Combined approach**

Combined approach has the same accuracy as correlated approach



#### **Conclusion**

- Live trace synchronization is ready for deployment.
- The combined approach offers an excellent compromise between performance and accuracy.

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