Scalable In-memory Checkpoint with Automatic Restart on Failures

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Problem



- Increasing number of sockets
 - Sequoia 98304, predicted Exascale 200000
- More frequent failures
 - MTBF of the Exacale machine will be 720 seconds if MTBF per socket remains at 5 years.

Our Philosophy

Runtime system support for fault tolerance

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- Checkpoint Restart
- Message Logging
- Proactive Migration

Our Philosophy

- Runtime system support for fault tolerance
- Keep progress rate despite of failures
 - Optimize for the common case
 - Minimize performance overhead



Optimize for the common case

- Failures rarely bring down more than one node
- In Jaguar (now Titan, top 1 supercomputer), 92.27% of failures are individual node crashes



Minimize performance overhead

- Decrease interference with application
- Parallel recovery
- Automatic restart:
 - Failure detection in runtime system
 - Immediate rollback-recovery

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Faster checkpoint

Minimize performance overhead

- Decrease interference with application
- Parallel recovery
- Automatic restart:
 - Failure detection in runtime system
 - Immediate rollback-recovery
- Faster checkpoint



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Checkpoint and Restart for Leanmd



Limitation of Checkpoint/Restart



■ Increase in memory size per year: 41%

Increase in network bandwidth per year: 26%

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Outline

1 Checkpoint/Restart

- Synchronous
- Asynchronous
- Model
- 2 Minimize checkpoint interference to application
 - Priority sending queue
 - Opportunistic vs. random scheduling
- 3 Relieve memory pressure with SSD
- 4 Experiments

5 Conclusion

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Synchronous

Synchronous Checkpoint



- Each node has a buddy node to store the checkpoint.
- Resume computation after all the nodes have successfully saved the checkpoints in their buddy nodes.

Asynchronous

Solution: Asynchronous Checkpoint



- Resume computation as soon as each node stores its own checkpoint (local checkpoint).
- Interleave the transmission of the checkpoint to buddy with application execution (remote checkpoint).

Asynchronous Checkpointing

└─ Checkpoint/Restart

Asynchronous



- Probability to roll back to the previous checkpoint when checkpointing overlaps with application
- Interference of the remote checkpoint to application

$$T = T_s + T_{local} + T_{overhead} + T_{rework} + T_{restart}$$



- *T_s* Workload
- *T_{local}* Time for local checkpoint
- *T*_{overhead} Interference of global checkpoint
- *T_{rework}* Lost work for application
- *T_{restart}* Time to restart application

 \Box Checkpoint/Restart

Model

Local Checkpoint Overhead



- Local checkpoint *T*_{local}
 - Checkpoint interval τ
 - Work finished in one checkpoint interval $\tau \varphi$
 - Number of checkpoints $\frac{T_s}{\tau \varphi}$

L Model

Local Checkpoint Overhead



- Local checkpoint *T*_{local}
 - \blacksquare Checkpoint interval τ
 - Work finished in one checkpoint interval $\tau-\varphi$
 - Number of checkpoints $\frac{T_s}{\tau \omega}$
 - Local checkpoint overhead for one checkpoint δ

$$T_{local} = \frac{T_s}{\tau - \varphi} \delta$$

L_Model

Remote Checkpoint Interference



- Interference of remote checkpoint to application *T*_{overhead}
 - \blacksquare Interference for one checkpoint φ

$$T_{overhead} = \frac{I_s}{\tau - \varphi} \varphi$$

Model

Rework and Restart Time



Rework time *T_{rework}* Number of failures *T*/*MTBF*

Model

Rework and Restart Time



Rework time T_{rework}

- Number of failures $\frac{T}{MTBF}$
- Failure 1: at least $\theta \varphi$

Model

Rework and Restart Time



- Rework time Trework
 - Number of failures $\frac{T}{MTBF}$
 - Failure 1: at least $\theta \varphi$
 - Failure 2: at most $\theta \varphi + \tau + \delta$

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L Model

Rework and Restart Time



Rework time T_{rework} Number of failures $\frac{T}{MTBF}$ Failure 1: at least $\theta - \varphi$ Failure 2: at most $\theta - \varphi + \tau + \delta$ $T_{rework} = \frac{T}{MTBF} (\frac{\tau+\delta}{2} + \theta - \varphi)$

L Model

Rework and Restart Time



- Rework time T_{rework}
 Number of failures
 - Number of failures $\frac{T}{MTBF}$
 - Failure 1: at least $\theta \varphi$
 - Failure 2: at most $\theta \varphi + \tau + \delta$

$$T_{rework} = \frac{T}{MTBF} \left(\frac{\tau + \delta}{2} + \theta - \varphi \right)$$

Restart time T_{restart}

Restart time for one failure R

$$T_{restart} = \frac{T}{MTBF}R$$

$$T = T_{s} + \frac{T_{s}}{\tau - \varphi}\delta + \frac{T_{s}}{\tau - \varphi}\varphi + \frac{T}{MTBF}\left(R + \frac{\tau + \delta}{2} + \theta - \varphi\right)$$
$$T_{blocking} = T_{s} + \frac{T_{s}}{\tau_{blocking}}\delta_{blocking} + \frac{T_{blocking}}{MTBF}\left(R + \frac{\tau_{blocking} + \delta_{blocking}}{2}\right)$$
$$Benefit = \frac{T_{blocking} - T}{T_{blocking}}$$

- Minimize checkpoint interference to application

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-Minimize checkpoint interference to application

Charm++ Runtime System

- Object based over-decomposition
- Asynchronous method invocation
- Migratable-object runtime system
- Worker thread & Communication thread



Asynchronous Checkpointing

- Minimize checkpoint interference to application
 - Priority sending queue

Minimize Checkpoint Interference



- Separate checkpoint message queue
- Send checkpoint message only when there is no application message ready to be sent
- Better overlap with computation

Asynchronous Checkpointing

Minimize checkpoint interference to application

Opportunistic vs. random scheduling



- Use lottery scheduling to change the overlap period
- Probabilistic deciding whether application or checkpoint queue can send message

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Relieve memory pressure with SSD

Choose Data to Store in SSD

 Solid State Drive: becoming increasingly available on individual nodes

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- Full SSD strategy
- Half SSD strategy
 - Only store remote checkpoint in SSD
 - Faster checkpoint and restart

Relieve memory pressure with SSD

Asynchronous Checkpointing to SSD with IO thread



IO threads

- Write checkpoint to/Read checkpoint from SSD
 When receive request from worker thread.
- Notify worker thread When SSD is done with certain request.

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Machine

- Trestles @ SDSC
- 324 32-core nodes
- 120 GB flash memory (SSD) per node
- 100 Teraflops
- Applications
 - Wave2D: stencil computation
 - ChaNGa: N-Body simulation

Single Checkpoint Overhead



Wave2D Weak Scale

ChaNGa Strong Scale

- Semi-Blocking checkpoint reduces checkpoint overhead significantly.
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Semi-Blocking Benefit



Wave2D Weak Scale

ChaNGa Strong Scale

Semi-Blocking checkpoint reduces the total execution time up to 22%.

Checkpoint/Restart on SSD



 Restart from SSD does not incur extra overhead

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- Asynchronous checkpointing can help hide the checkpoint overhead.
- SSD can be used in checkpointing to relieve memory pressure with little overhead.

- Conclusion

Future Work

Log analysis is very helpful

- Failure distributions
- Cluster usage
- Failure prediction with different fault tolerate actions
 - Proactive migration
 - Proactive checkpoint
- Multilevel checkpointing

Thank you!

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- Conclusion

Increasing Checkpoint Overhead



- Checkpoint size: 16MB per core
- Checkpoint data is sent to another node across the network

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