# **High Performance Computing**

2015/02/02 Kazuki Tsuzuku Endo lab.

## **Review Paper**

Title:

Energy Consumption of Resilience Mechanisms in Large Scale Systems

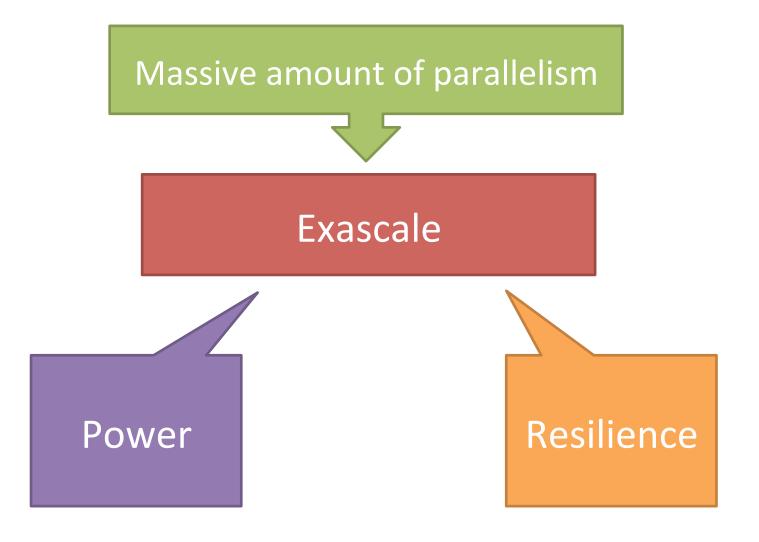
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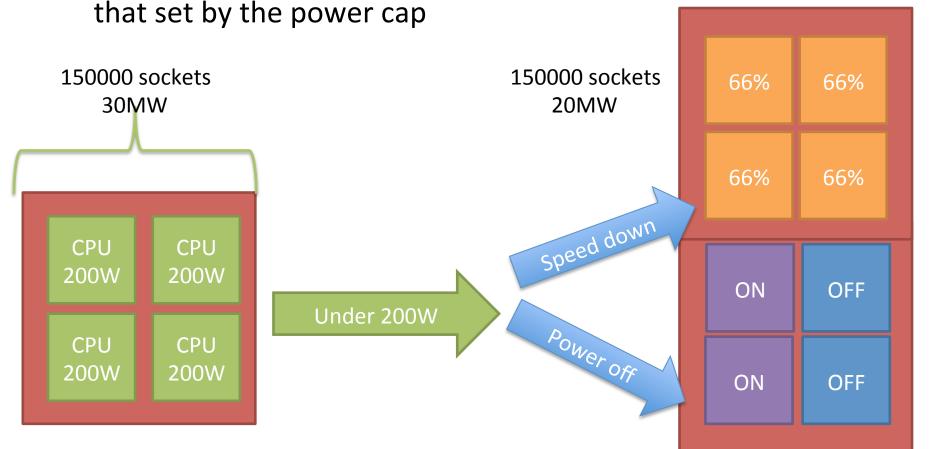
# Challenges of Exascale



#### Power of Exascale

- Established by the DOE at no more than 20MW
  - Top1 Tianhe-2 33.9PFLOPS 17.8MW

The machines will be capable of consuming more power than
that set by the power cap



#### Resilience of Exascale

- The number of components will grow
  - →system failures will become routine
- Resilience scheme must consider its effect on the application's energy and power consumption
- Reduce considerably the overall performance

# Objectives and achievements

#### Related Work

- Energy considerations in checkpointing and fault tolerance protocols[M. el Mehdi Diouri, et al. 2012]
  - Measure energy consumption of the three main tasks associated with checkpoint-restart methods
- Assessing Energy Efficiency of Fault Tolerance Protocols for HPC Systems[Esteban Meneses, et al. 2012]
  - Evaluate the energy consumption for three different checkpointing technique
  - Find that uncoordinated checkpointing with parallel recovery was the best technique
  - Show that as the number of sockets grows beyond 25600 the trend in energy savings of parallel recovery is decreasing
  - → This work shows that replication increase energy saving as the system size grows

#### Resilience Methods

- Coordinated Checkpoint/Restart
- Uncoordinated Checkpointing
- Traditional Replication
- Replication Optimizations

# Coordinated Checkpoint/Restart

- All running processes periodically pause their execution and write their state to a stable storage device
- In the event of a failure, all processes restore from the checkpoint and resume execution
- This methods are the most widely used fault tolerance method in HPC

# **Uncoordinated Checkpointing**

- Improve the performance of checkpointing systems
  - Assumes the availability of local storage
- Nodes checkpoint and restore from local storage without the synchronization
- Result in cascading rollbacks

# **Traditional Replication**

- Each application process is replicated on independent computing node
- Replication in HPC has largely been dismissed
  - Additional resources required
  - In this paper, proposed replication techniques use fewer resources

## Replication Optimizations

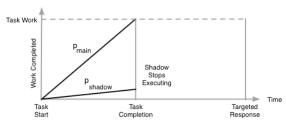
- Power-aware optimizations to traditional replication
  - Stretched Replication
  - Shadow Replication

## Stretched Replication

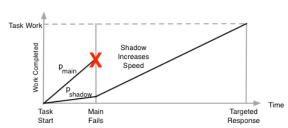
- Assume that performing work slowly can save energy
- Slow down the execution of all processes
  - To satisfy power limits
  - To increase reliability

# **Shadow Replication**

- performing work slowly can save energy
  - This is not always the case in today's computers
    - "overhead" power 60~67%
  - Time vs power tradeoff
- The shadow executes concurrently with the main process
  - If no failure occurs
    - The main process executes at the optimal speed
    - The shadow process executes at the reduced speed
  - If main process fails
    - The shadow process increases its speed and executes the task



(a) Case of no failure



(b) Case of failure

## Analytical Framework

- Computational Model
- Power Model
- Failure Model
- Checkpointing Energy Model
- Replication Energy Model

## Computational Model

- Distributed computing environment of a large number of collaborative tasks
  - The successful execution of the application depends on the successful of all tasks
- Assume the application is perfectly parallizable
  - Total amount of work "W"
  - The work is evenly divided into "N"
  - Work for each socket "W<sub>task</sub>=W/N"
  - Speed of each socket "σ"
  - The total solution time for application when all sockets are operating at maximum speed " $T_s = W_{task}/\sigma_{max}$ "
  - Targeted response time "t<sub>resp</sub>", which is the maximum time that the process will complete it's task
  - Targeted response time as a laxity factor " $\alpha$ "
    - In this framework  $\alpha$ =2.0

#### Power Model

- P=A\*C\*V<sup>2</sup>\*f
  - P:Dynamic CPU power,A:chip activity factor
     C:capacitance,V:voltage,f:frequency
  - Scaling both voltage and frequency
     →P(σ)=σ³
- The energy consumed by a socket executing at speed "σ" during an interval [t<sub>1</sub>,t<sub>2</sub>]
  - fixed factor for overhead power "ρ"

$$E_{soc}(\sigma, [t_1, t_2]) = \int_{t=t_1}^{t_2} (\sigma^3 + \rho \sigma_{max}^3) dt$$

- The energy consumed while writing or recovering a checkpoint
  - Fixed factor for maximum I/O power "γ"

$$E_{io}([t_1, t_2]) = \int_{t=t_1}^{t_2} (\gamma \sigma_{max}^3) dt = (\gamma \sigma_{max}^3)(t_2 - t_1)$$

#### Failure Model

- Assumptions
  - Failures are independent events
  - Only a single failure an occur during the execution of a task
- Probability of the main task failing at time t
  - The socket MTBF "M<sub>soc</sub>"

$$f(t) = \frac{1}{M_{soc}} e^{-t/M_{soc}}$$

# Checkpointing Energy Model

- Total wall clock time computed by Daly
  - T<sub>s</sub>:original total solve time,M<sub>sys</sub>:system MTBF γ:checkpoint interval,δ:checkpoint time,R:recovery time

$$T_w = M_{sys}e^{R/M_{sys}}(e^{(\tau+\delta)/M_{sys}} - 1)(\frac{T_s}{\tau} - \frac{\delta}{\tau + \delta})$$

The Energy for a single process using checkpoint and restart

$$E_{cpr} = E_{soc}(\sigma_{max}, [0, T_w])$$

$$+ E_{io}([0, \delta)]) \times \frac{T_s}{\tau} + E_{io}([0, R)]) \times \frac{T_w}{M_{sys}}$$

# Replication Energy Model

Energy consumption of the combination of replication and checkpointing

$$\begin{split} E_{rep} &= \int_{t=0}^{t_c} (E_{soc}(\sigma_{max}, [0, t]) + E_{soc}(\sigma_b, [0, t])) f(t) dt \\ &+ \int_{t=0}^{t_c} E_{soc}(\sigma_a, [t, t_r]) f(t) dt \\ &+ (1 - \int_{t=0}^{t_c} f(t) dt) (E_{soc}(\sigma_{max}, [0, t_c]) + E_{soc}(\sigma_b, [0, t_c])) \\ &- t_c = W_{task} / \sigma_{max}, \ t_r = t_f + (W_{task} - \sigma_b t_f) / \sigma_{a}, \end{split}$$

- $-\sigma_a = \sigma_{max}$ , this is because we can trade the power consumed by the main process with the shadow process after failure of the main
- Traditional replication

$$-\sigma_{m} = \sigma_{b} = \sigma_{a} = \sigma_{max}$$

Stretched replication

$$-\sigma_{\rm m} = \sigma_{\rm b} = \sigma_{\rm a} = W_{\rm task} / T_{\rm resp}$$

## Analysis

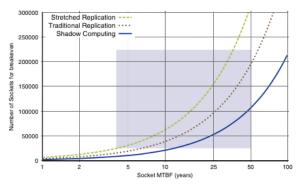
- Scaling and Failure Rates
- Scaling at Different Checkpoint I/O Rates
- Scaling at Different Overhead Power
- Energy Savings

## Scaling and Failure Rates

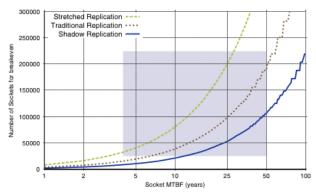
- Breakeven point at which the replication technique is equivalent to that provided by coordinated checkpointing
  - Metrics are energy and time
  - Checkpoint time is 15 minutes

### Scaling and Failure Rates

- Shadow replication can provide a significant energy saving over traditional replication
  - e.g. when MTBF is 25 years 46% energy efficiency
- Stretched replication turns out to be less energy efficient
  - Because of the increased time
- Shadow replication time is shorter than that provided by traditional replication
  - e.g. when MTBF is 25 years 46% performance improvement
  - Shadow replication can utilize additional sockets
  - Stretched replication is similar to shadow replication but both the replica and main use less power



(a) Breakeven Energy



(b) Breakeven Time

Overhead %	Method	# Sockets	# Main Sockets
60% 60% 60% 60%	Checkpointing Traditional Replication Stretched $\alpha=2.0$ Shadow $\alpha=2.0$	100,000 100,000 153,846 124,998	100,000 50,000 76,923 62,499
80% 80% 80% 80%	Checkpointing Traditional Replication Stretched $\alpha=2.0$ Shadow $\alpha=2.0$	100,000 100,000 120,230 110,636	100,000 50,000 60,115 55,318

# Scaling at Different Checkpoint I/O Rates

- The checkpoint write times have a significant effect on the efficiency of coordinated checkpointing
- Shadow replication is viable for all
  - But very extreme levels of I/O bandwidth

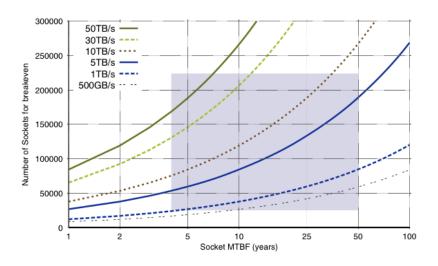


Fig. 4. Shadow replication energy breakeven for different I/O bandwidths. Assumes 16Gb per socket.

#### Scaling at Different Overhead Power

- The number of available sockets decreases as the percentage of overhead power increases
- As the power overhead increases the potential energy savings also decreases

 Even if the overhead is 100% it will be no worse than traditional replication

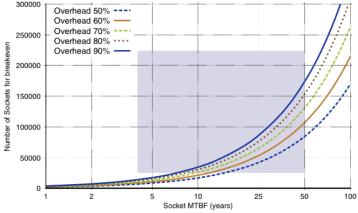
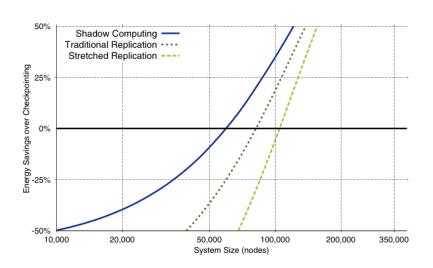


Fig. 5. Shadow replication energy breakeven for various overhead power percentages. Checkpoint time of 15 minutes.

## **Energy Savings**

- Relative energy savings
  - 1TB/s I/O bandwidth
  - 25 Year MTBF
- Shadow replication consistently consumes about 20% less energy than that consumed by pure replication



## Implementation and evaluation

- Implemented the replication techniques in MPI and measured the energy
- Experiment environment
  - 104nodes, each with a AMD Llano Fusion, which is a 4-core AMD K10 x86 paired with a 400-core Radeon HD 6550D
- Evaluated applications
  - LAMMPS
    - Molecular dynamics code
  - HPCCG
    - Conjugate gradient solver
  - miniFE
    - Implicit finite element method

## **Experimental Results**

- HPCCG and miniFe show the maximum energy saving
  - Simple applications that are processor bound
- To confirm assumptions about overhead power
  - Lowest possible execution speed
    - CPU consumes 40% of the overall
  - Full power
    - CPU consumes 71% of the overall
  - Estimated amount of overhead power is 67%

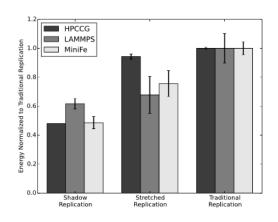


Fig. 7. Experimental results of the energy savings achieved by different replication schemas.

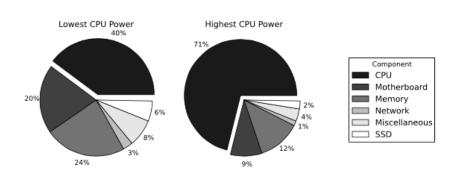


Fig. 8. Component level energy usage for LAMMPS

#### Conclusion

- Show the benefit of power-aware modifications to replication
  - 40% more time and energy efficient
- This savings makes replication a viable fault tolerance solution through the majority of the exascale-class design space
- Demonstrate at small scale

#### Discussion

 Viable of shadow replication for extreme levels of I/O bandwidth