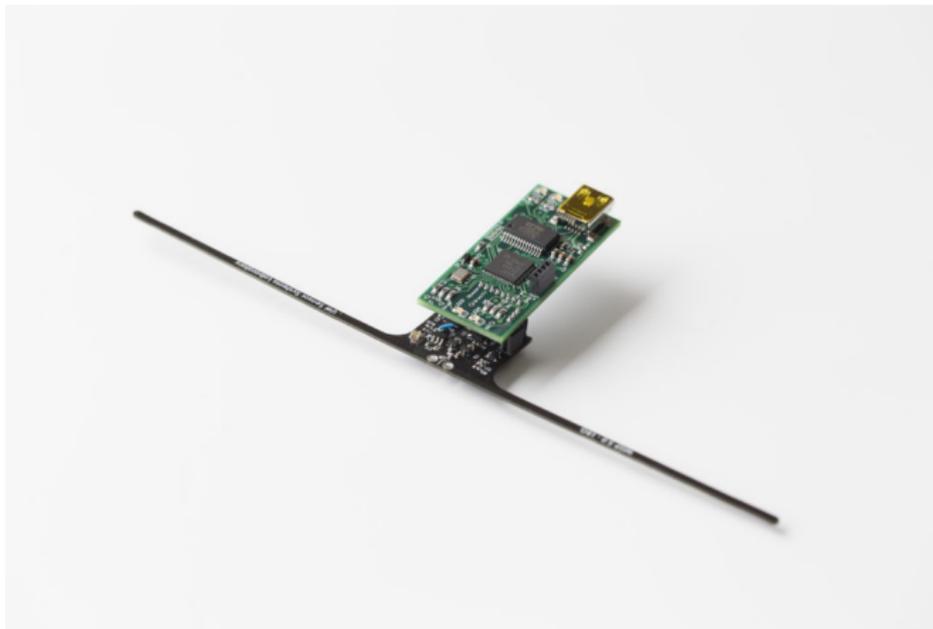


Adaptive Dynamic Checkpointing for Safe Efficient Intermittent Computing

Kiwan Maeng Brandon Lucia

Energy-Harvesting Devices



Intermittent Computing



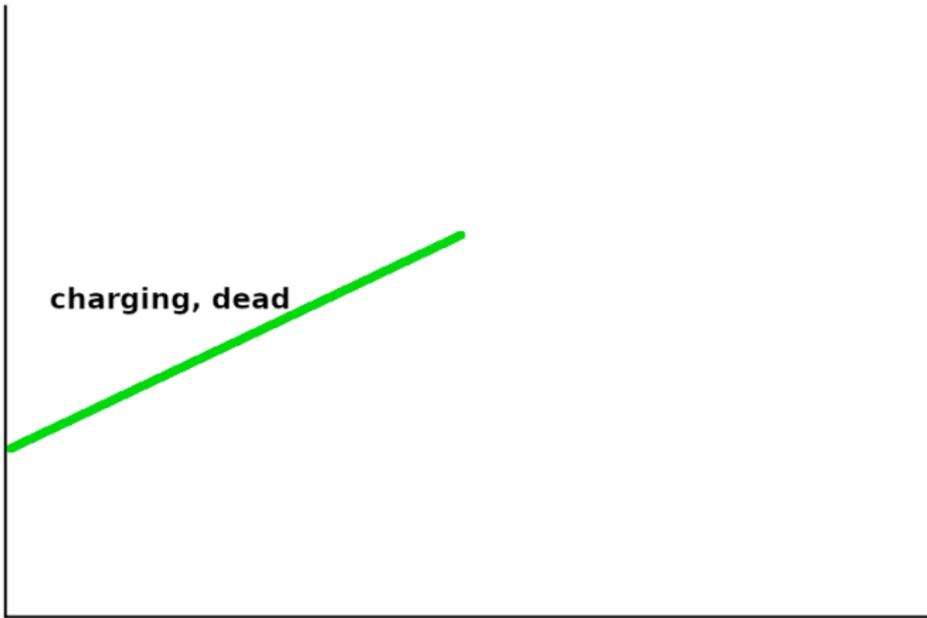
**Available
energy**

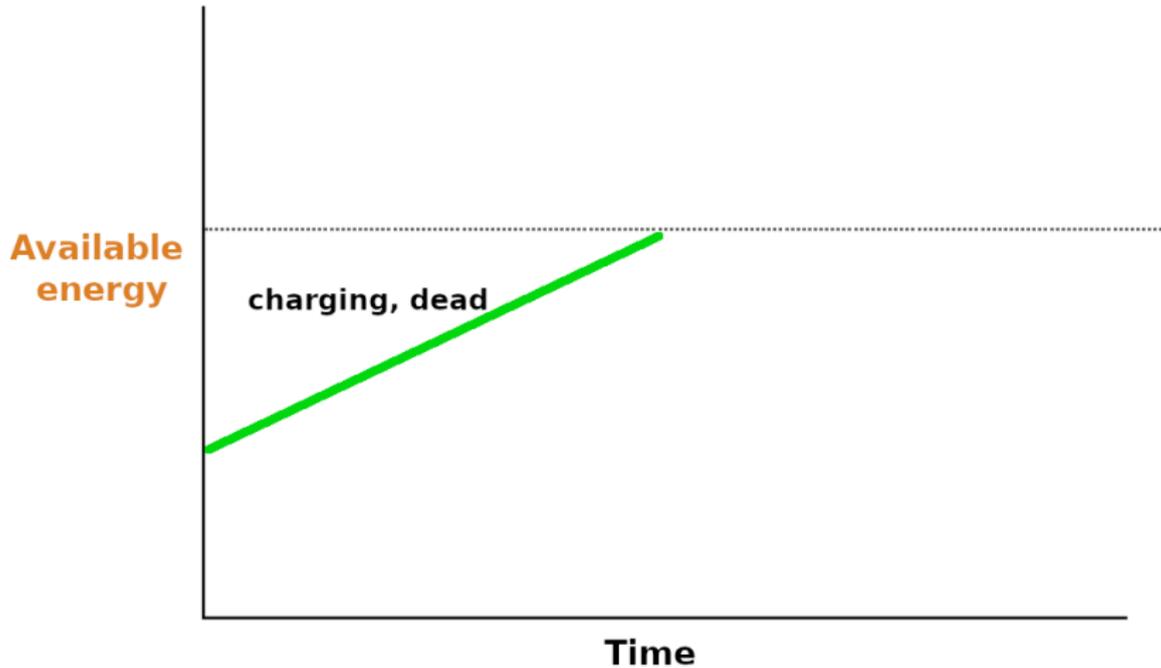
Time

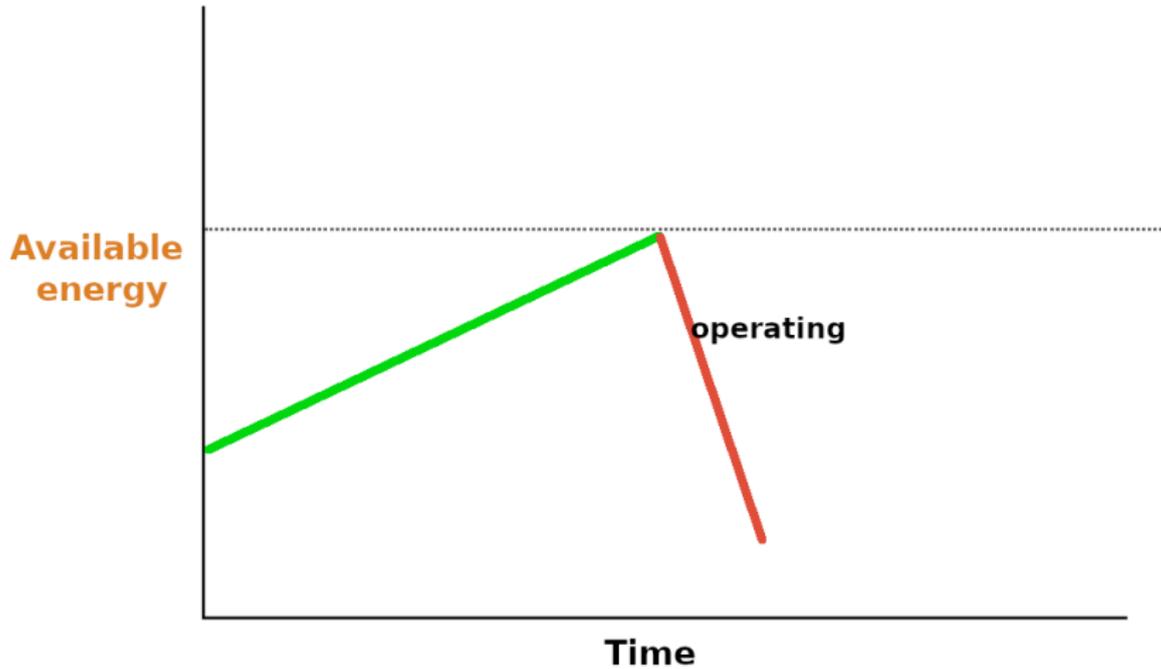
**Available
energy**

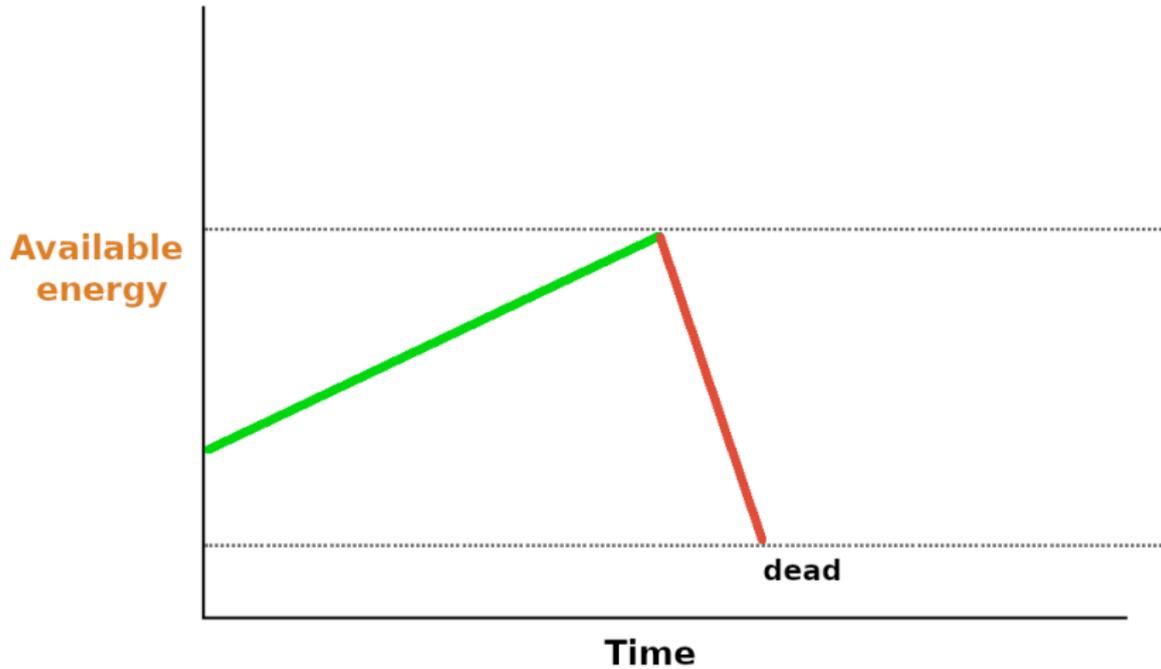
charging, dead

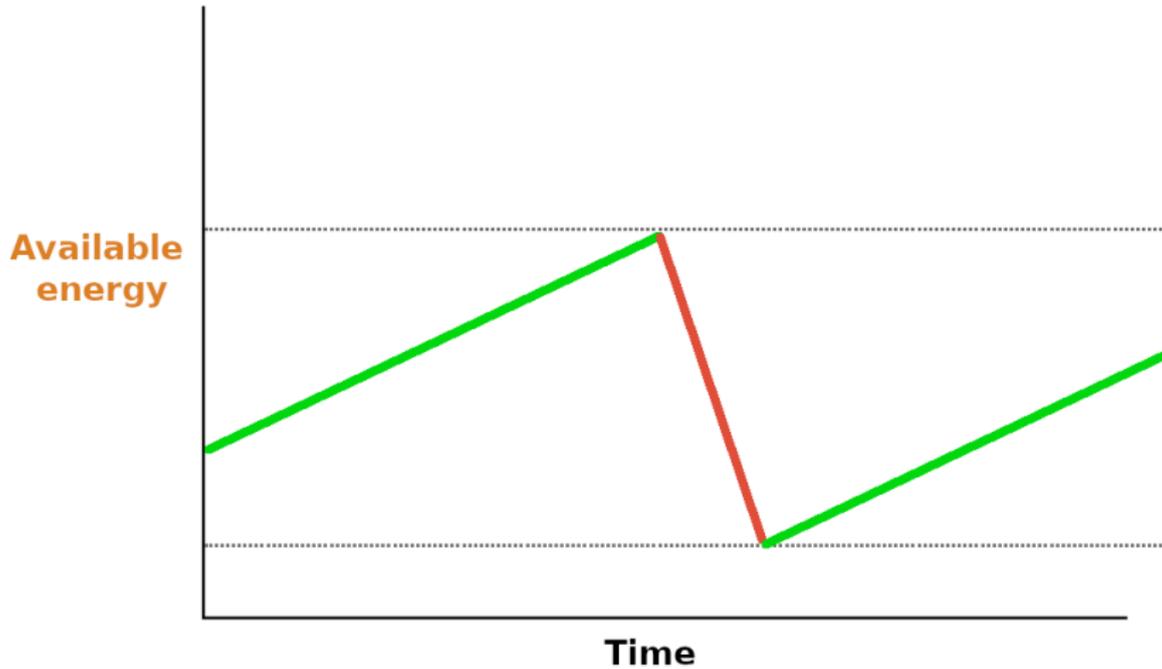
Time











Prior Work

- ▶ General idea: periodically save state to non-volatile memory

- ▶ General idea: periodically save state to non-volatile memory
- ▶ Two main approaches:

- ▶ General idea: periodically save state to non-volatile memory
- ▶ Two main approaches:
 - ▶ Explicit tasks

- ▶ General idea: periodically save state to non-volatile memory
- ▶ Two main approaches:
 - ▶ Explicit tasks
 - ▶ Automatic checkpointing

Alpaca

Alpaca - explicit tasks

Problems:

- ▶ Programmability overhead

Alpaca - explicit tasks

Problems:

- ▶ Programmability overhead
- ▶ Not obvious how to estimate energy use of code

Alpaca - explicit tasks

Problems:

- ▶ Programmability overhead
- ▶ Not obvious how to estimate energy use of code
- ▶ Not portable

Ratchet

Ratchet - automatic checkpointing

Problems:

- ▶ High execution overhead

Ratchet - automatic checkpointing

Problems:

- ▶ High execution overhead
 - ▶ Ratchet inserts checkpoints between every Write-After-Read dependency

Ratchet - automatic checkpointing

Problems:

- ▶ High execution overhead
 - ▶ Ratchet inserts checkpoints between every Write-After-Read dependency
- ▶ No task atomicity

Ratchet - automatic checkpointing

Problems:

- ▶ High execution overhead
 - ▶ Ratchet inserts checkpoints between every Write-After-Read dependency
- ▶ No task atomicity
- ▶ Might be hard to solve/pin-point non-termination issues

Let's solve all of these!

Chinchilla

Correct, **H**ardware-agnostic **I**ntermittent
Checkpointing **I**nstrumentation **L**ayer with
Low-overhead **A**dapation



Strategy:

- ▶ overprovision checkpoints

Strategy:

- ▶ overprovision checkpoints
- ▶ dynamically deactivate unnecessary ones at run-time

This should give us:

- ▶ No programmability overhead

This should give us:

- ▶ No programmability overhead
 - ▶ Just write C!

This should give us:

- ▶ No programmability overhead
 - ▶ Just write C!
- ▶ Tends towards minimal runtime overhead

This should give us:

- ▶ No programmability overhead
 - ▶ Just write C!
- ▶ Tends towards minimal runtime overhead
- ▶ Portable to systems with different energy buffers

Approach

- ▶ Instrument code with checkpoints

Approach

- ▶ Instrument code with checkpoints
- ▶ Start a timer

Approach

- ▶ Instrument code with checkpoints
- ▶ Start a timer
- ▶ Execute checkpointing code only if timer passed a threshold

Approach

- ▶ Instrument code with checkpoints
- ▶ Start a timer
- ▶ Execute checkpointing code only if timer passed a threshold
 - ▶ We start with a high threshold

Approach

- ▶ Instrument code with checkpoints
- ▶ Start a timer
- ▶ Execute checkpointing code only if timer passed a threshold
 - ▶ We start with a high threshold
- ▶ At next reboot, if we hadn't hit a checkpoint, halve the timer threshold

- ▶ Once we find an interval that works, increase threshold to median of new and old thresholds

- ▶ Once we find an interval that works, increase threshold to median of new and old thresholds
- ▶ Binary search for an optimal interval!

Further timer adaptation

When checkpoints are not frequent enough

- ▶ Occasional power failures without a checkpoint are not a bad sign

When checkpoints are not frequent enough

- ▶ Occasional power failures without a checkpoint are not a bad sign
 - ▶ Means we're close to the actual operating period

When checkpoints are not frequent enough

- ▶ Occasional power failures without a checkpoint are not a bad sign
 - ▶ Means we're close to the actual operating period
- ▶ Failure followed by a successful checkpoint - make a small decrement to timer interval

When checkpoints are not frequent enough

- ▶ Occasional power failures without a checkpoint are not a bad sign
 - ▶ Means we're close to the actual operating period
- ▶ Failure followed by a successful checkpoint - make a small decrement to timer interval
- ▶ Many consecutive failures - halve the timer

When checkpoints occur too frequently

- ▶ Hit two checkpoints during an interval - double the timer

When checkpoints occur too frequently

- ▶ Hit two checkpoints during an interval - double the timer
- ▶ Optimization timer:

When checkpoints occur too frequently

- ▶ Hit two checkpoints during an interval - double the timer
- ▶ Optimization timer:
 - ▶ second timer with slightly higher threshold than checkpoint timer

When checkpoints occur too frequently

- ▶ Hit two checkpoints during an interval - double the timer
- ▶ Optimization timer:
 - ▶ second timer with slightly higher threshold than checkpoint timer
 - ▶ if the optimization timer expires before a power failure, make small increment to checkpoint timer

Instrumentation Implementation

Checkpoints

- ▶ Checkpoints added between each basic block

Checkpoints

- ▶ Checkpoints added between each basic block
 - ▶ easily identifiable

Checkpoints

- ▶ Checkpoints added between each basic block
 - ▶ easily identifiable
 - ▶ occurs frequently

Checkpoints

- ▶ Checkpoints added between each basic block
 - ▶ easily identifiable
 - ▶ occurs frequently
 - ▶ easy to measure block energy cost

Checkpoints

- ▶ Checkpoints added between each basic block
 - ▶ easily identifiable
 - ▶ occurs frequently
 - ▶ easy to measure block energy cost
 - ▶ easy to subdivide if necessary

Protected variables

- ▶ Identify protected variables via liveness analysis

Protected variables

- ▶ Identify protected variables via liveness analysis
- ▶ If x 's live-range crosses a checkpoint, it needs to be protected

Protected variables

- ▶ Identify protected variables via liveness analysis
- ▶ If x 's live-range crosses a checkpoint, it needs to be protected
 - ▶ allocated in non-volatile memory

Protected variables

- ▶ Identify protected variables via liveness analysis
- ▶ If x 's live-range crosses a checkpoint, it needs to be protected
 - ▶ allocated in non-volatile memory
 - ▶ consistency between reboots thanks to undo logging

Protected variables

- ▶ Identify protected variables via liveness analysis
- ▶ If x 's live-range crosses a checkpoint, it needs to be protected
 - ▶ allocated in non-volatile memory
 - ▶ consistency between reboots thanks to undo logging
 - ▶ log before every potential write to a protected variable that may be the variable's first write since a checkpoint

Reinitialization

- ▶ On startup, reinitialization is first ran in `main`

Reinitialization

- ▶ On startup, reinitialization is first ran in `main`
- ▶ Calls programmer-provided `init` to setup peripherals

Reinitialization

- ▶ On startup, reinitialization is first ran in `main`
- ▶ Calls programmer-provided `init` to setup peripherals
- ▶ Restores protected variables from log

Non-volatile stack

- ▶ After compilation, some parts of the stack also need to be protected

Non-volatile stack

- ▶ After compilation, some parts of the stack also need to be protected
- ▶ Store them on a non-volatile stack

Non-volatile stack

- ▶ After compilation, some parts of the stack also need to be protected
- ▶ Store them on a non-volatile stack
- ▶ For consistency, keep track of top and depth pointer

Non-volatile stack

- ▶ After compilation, some parts of the stack also need to be protected
- ▶ Store them on a non-volatile stack
- ▶ For consistency, keep track of top and depth pointer
 - ▶ depth is the deepest the stack has popped to since last checkpoint

Non-volatile stack

- ▶ After compilation, some parts of the stack also need to be protected
- ▶ Store them on a non-volatile stack
- ▶ For consistency, keep track of top and depth pointer
 - ▶ depth is the deepest the stack has popped to since last checkpoint
 - ▶ at next checkpoint, need to back up what's between the two pointers

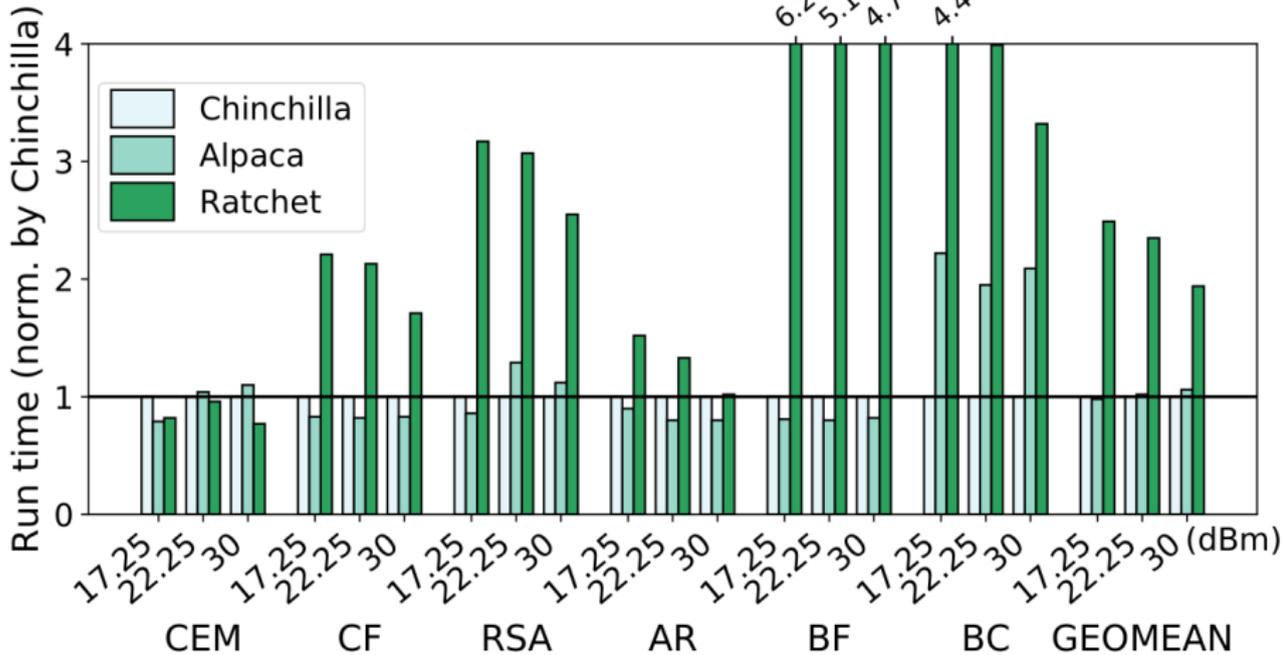
Benchmarks

- ▶ Compared to Alpaca and Ratchet

- ▶ Compared to Alpaca and Ratchet
- ▶ Average speed-up of 2.25x over Ratchet

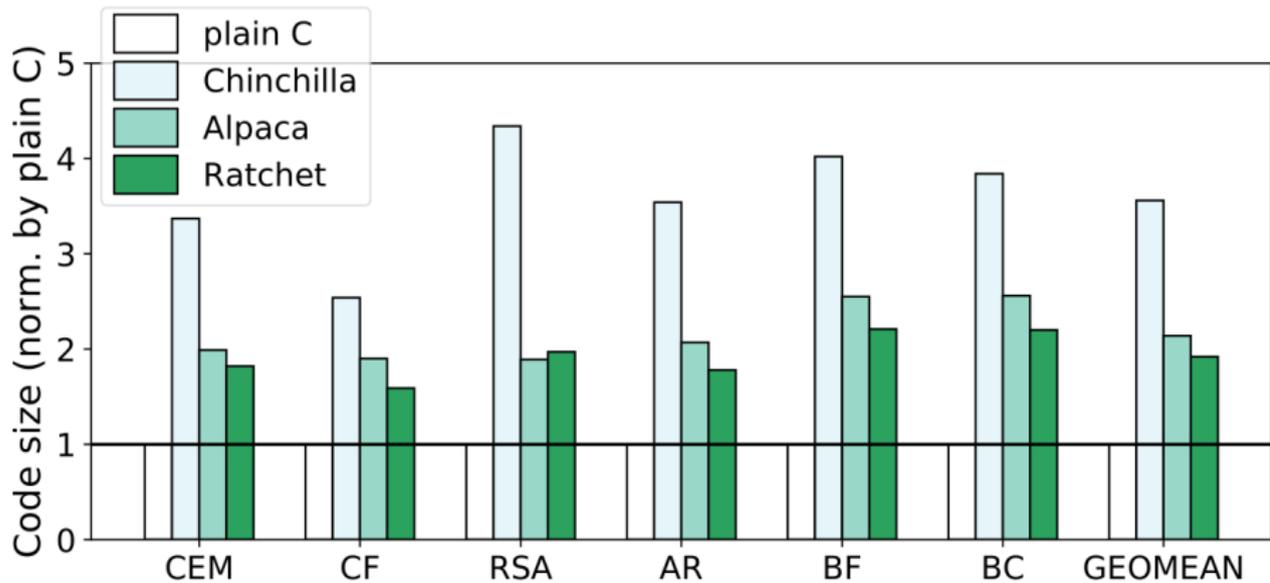
- ▶ Compared to Alpaca and Ratchet
- ▶ Average speed-up of 2.25x over Ratchet
- ▶ Similar performance to Alpaca, 2% speedup on average

- ▶ Compared to Alpaca and Ratchet
- ▶ Average speed-up of 2.25x over Ratchet
- ▶ Similar performance to Alpaca, 2% speedup on average
- ▶ Orders of magnitude less checkpoints than either solution



# Checkpoints	RSA	CEM	BC
Chinchilla	16	30	15
Alpaca	315	1611	710
Ratchet	7643	2319	8907

Chinchilla does end up with larger binary size - cost we pay for performance and reliability.



Authors

- ▶ Kiwan Maeng - PhD student

Authors

- ▶ Kiwan Maeng - PhD student
- ▶ Brandon Lucia

Authors

- ▶ Kiwan Maeng - PhD student
- ▶ Brandon Lucia
 - ▶ Recommended watching: [Reliable Intermittent Computing](#)