

DAMON and DAMOS: Writing a fine-grained access pattern oriented lightweight kernel module using DAMON/DAMOS in 10 minutes

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Disclaimer

- The views expressed herein are those of the speaker; they do not reflect the views of his employers
- My cat might come up on the screen. The cat has no '--silent' option. Sorry, please don't be scared; keep calm and blame COVID19 :P



https://twitter.com/sjpark0x00/status/1295387149018300419/photo/1

- I, SeongJae Park <sj@kernel.org>
 - Kernel / Hypervisor Engineer at Amazon Web Services
 - Interested in the memory management and the parallel programming
 - Developing DAMON



This Talk...

- Will not explain how DAMON works internally
 - For that, you can refer to
 - other resources in the project site (https://damonitor.github.io) or
 - the code (https://git.kernel.org/sj/h/damon/next)
- Will explain
 - How, and what kernel hackers (or their kernel subsystems) can get from DAMON (and its not-yet-mainlined features)
 - Things for user-space will not be explained, as this is the Kernel Summit
- Will also discuss about future plans on
 - Extending DAMON for more usages,
 - Improving DAMON itself, and
 - Enhancing MM with DAMON

Overview

- Motivation
- DAMON
- DAMOS
- DAMON_RECLAIM
- Future Plans
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Motivation

- Demand for memory is increasing but DRAM supply is not
 - Memory management efficiency is becoming even more important
- Linux MM works with not-so-fine data access information
 - The monitoring overhead is one of the biggest reason



(Images retrieved from https://oatao.univ-toulouse.fr/24818/1/nitu_24818.pdf)

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- Motivation
- DAMON
 - Intro
 - DAMON Programming Interface
 - Live-coding a Working Set Size Estimation Module
 - DAMON Evaluation
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DAMON: Data Access MONitor

- A framework for general Data Access MONitoring
 - Provides access frequency of each memory region
 - Allows users practically trade monitoring accuracy for less overhead
 - Provides best-effort accuracy under the condition
 - Users can set upper-bound overhead regardless of the memory size
 - Conceptually scans memory for every 5ms with < 2% CPU utilization
- The source code is available in
 - Development tree (several not-yet-mainlined features are also here)
 - Back-ports of the development tree for upstream v5.10.y and v5.4.y
 - Amazon Linux kernels (v5.10.y and v5.4.y)
 - The mainline from v5.15-rc1
- A user-space tool and a tests suite are available under GPL v2

How to Use DAMON Programming Interface

- Step 1: Set the requests in 'struct damon_ctx' instances
 - How, what memory regions of which address spaces should be monitored
 - Where monitoring event notifications should be delivered (callbacks)
 - Users can read the monitoring results or cleanup things inside the function
- Step 2: Start DAMON with the request via 'damon_start()'
 - Then, a kernel thread for the monitoring is created for each request
- Step 3: Do your work in the notification callbacks
 - Monitoring results can be read via 'damon_region's in the 'damon_ctx'
- Step 4: Finish the monitoring by calling 'damon_stop()'

Live-coding a Working Set Size Estimation Module

- Let's write a kernel module that
 - Receives pid of a process as a parameter
 - Calculates working set size of the process and log it every 100ms

Live-coding a Working Set Size Estimation Module

- Let's write a kernel module that
 - Receives pid of a process as a parameter
 - Calculates working set size of the process and log it every 100ms
 - Live-coded one will be available here
 - Seven lines of code in essence for starting DAMON

Testing The Module

- We will test that against
 - Artificial access pattern generator ('\$./masim ./configs/stairs.cfg')
 - Allocates ten 10 MiB objects, accesses all objects for first 10 secs, then accesses the first object for 5 secs, then the second object for 5 secs, ...
- We can expect the process will have 100 MiB RSS, while the module reports 10 MiB working set size, after first 10 seconds



Evaluation: How Light-weight DAMON Is?

- For virtual address and physical address monitoring, DAMON...
 - makes the workload 0.62% and 1.53% slower, and
 - Uses 1.76% and 0.96% of single CPU time, respectively
- The overhead is quite low
 - Note: DAMON conceptually scans the memory every 5ms in this case
 - Users can tweak its parameters for less overhead
 - e.g., increasing the memory scan time interval (5ms)

	orig	rec	prec
Runtime (seconds)	191.184		<u>191 928</u> (+1.53% to orig)
DAMON CPU Usage (%)	0	1.762	0.964

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Evaluation: How Accurate DAMON is?

- No good/easy way for strictly quantize the accuracy, but we can say
 - Visualized monitoring results look reasonable
 - The pattern for 'masim' shows expected ones with high accuracy
 - Note that we can adjust the tradeoff for higher accuracy
- More evidence on DAMON accuracy will be introduced in later slides



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DAMOS: DAMON-based Operation Schemes

- Imaginable usual DAMON-based MM optimization procedure
 - Monitor data access pattern of some memory range via DAMON,
 - Find regions of interest (e.g., hot or cold) from the results, and
 - Apply some memory management actions to the regions
 - e.g., reclaim cold memory regions, use THP for hot memory regions
- DAMOS is a feature of DAMON; it does above works instead of you
 - Users only need to specify
 - To what specific access pattern (how big, warm, and old) of memory regions
 - What MM action (e.g., reclaim, use THP, ...) they wan to be applied
- Merged in Amazon Linux but mainline, yet
 - Will post the patchset soon

How To Use DAMOS Programming Interface

- Put the monitoring request in 'struct damon_ctx', as above explained
- Create 'struct damos' objects and specify the schemes in there
- Specification of each scheme consists with
 - Ranges of size, access frequency, and age of the interest
 - 'age' means how long current access pattern has maintained
 - Memory management action that need to be applied to the found regions
- Put the 'struct damos' objects in the 'struct damon_ctx' instance
- Then, 'damon_start()' with the context
 - DAMON starts monitoring as requested in the context, finds the memory regions of the specified pattern, and applies the action

Live-coding a Proactive Reclamation Kernel Module

- Let's modify the previously written kernel module to
 - Reclaim memory regions of >=4K size that not accessed for >=3 secs

Live-coding a Proactive Reclamation Kernel Module

- Let's modify the previously written kernel module to
 - Reclaim memory regions of >=4K size that not accessed for >=3 secs
 - An example implementation is available here
 - Only two more lines of code in essential



Testing The Proactive Reclamation Module

- We will test that against the stairs access pattern, again
 - Allocates ten 10 MiB objects, accesses all for first 10 secs, then accesses the first object for 5 secs, then the second object for 5 secs, …
- The module is expected to
 - Shrink the process's RSS to 10 MiB after the first 13 seconds



Example Schemes For Evaluation of DAMOS

- ethp: Enhanced THP
 - MADV_THP for memory regions that real access is monitored
 - MADV_NOTHP for >=2MB memory regions that not accessed >=7 secs
 - Expected to reduce THP's internal fragmentation caused memory bloats

\$ cat ethp.damos # for regions having 5/100 access frequency, apply MADV_HUGEPAGE min max 5 max min max hugepage # for regions >=2MB and not accessed for >=7 seconds, apply MADV_NOHUGEPAGE 2M max min min 7s max nohugepage

- prcl: Proactive Reclamation
 - Reclaim memory regions that not accessed >= 10secs
 - Expected to reduce memory footage with minimal performance drops

\$ cat prcl.damos
for regions >=4KB and not accessed for >=10 seconds, apply MADV_PAGEOUT
4K max 0 0 10s max pageout

- 'ethp' reduces 76% of 'thp' ('always' THP policy) memory overhead while preserving 25% of 'thp' performance improvement
- 'prcl' saves 38.46% memory with 8.26% runtime slowdown
- Working as expected and seems effective (DAMON is accurate)
- But... 8.26% slowdown?



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DAMOS Challenges for Production Usage

- 8.26% slowdown of 'prcl' seems too huge for the production
 - Might be reasonable depending on the specific requirement, though
 - Can mitigate by tuning the scheme to be less aggressive
- DAMOS schemes tuning is challenging
 - Tuning is needed for for each workload and system
 - The thresholds are not intuitive for sysadmins
- Auto-tuning programs can be a solution
 - Our simple auto-tuner makes 'prcl' achieve
 - 24.97% memory saving with 0.91% runtime slowdown
 - (Untuned PRCL: 38.46% memory saving with 8.26% runtime slowdown)
- But, couldn't the kernel just work without such user-space help?

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 - DAMOS Safety Guarantees
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DAMOS Safety Guarantees

- For productions that prefer safety, DAMOS provides additional features
- Time/space quota per a given time interval
 - DAMOS uses CPU time no more than the given time quota
 - DAMOS applies the action to memory no more than the space quota
- Regions prioritization
 - Under the quota, DAMOS applies the action to prioritized regions first
 - Prioritization logic can be customized for different DAMOS actions
 - In case of RECLAIM, older and colder pages are prioritized by default
- Three watermarks (high, mid, low) with user-specified metric (e.g., freemem)
 - Deactivate if the metric > high_watermark or metric < low_watermark
 - Activate if the metric < mid_watermark and metric > low_watermark
 - Avoid DAMOS using any resource under a peaceful or a catastrophic situation

Evaluation of DAMOS Safety Guarantees

- 'prcl' for the physical address space with different safety guarantees
- Smaller time quota reduces DAMON's CPU usage and slowdown
 - Note that it also reduces the memory saving, as being less aggressive
- Enabling prioritization further reduces slowdown
- Still need tuning, but the knobs would be intuitive for sysadmins

time quota	prioritization	memory_saving	cpu_util	slowdown
N	N	47.16%	11.62%	5.40%
200ms/s	Ν	48.42%	10.92%	4.69%
50ms/s	Ν	40.84%	5.70%	4.53%
10ms/s	Ν	4.55%	1.78%	2.51%
200ms/s	Y	47.99%	10.41%	5.10%
50ms/s	Y	40.34%	5.16%	3.38%
10ms/s	Y	0.77%	1.37% 💙	1.84% 🕈

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DAMON_RECLAIM

- DAMON-based proactive reclamation kernel module
- Written using DAMOS
 - Excepting the code for module parameters, only 188 lines of code
- Aims to be used on production
 - Ensure the safety using the quotas and watermarks
 - The quotas ans watermarks can be tweaked via module parameters

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 - Improving MM with DAMON
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Extending DAMON (only brainstorming)

- DAMON can be extended for various address spaces and use cases
 - Need to implement new monitoring primitives for the use case
- Currently, monitoring primitives for only virtual address spaces, the physical address space, and page-granularity system monitoring are available
- Imaginable extensions include
 - More efficient page-granularity system monitoring
 - Current page-granularity monitoring is only for proof of concepts
 - MGLRU's page table-based scanning might be able to be used for this
 - for specific cgroups,
 - for only specific file-backed memory,
 - for read-only or write-only

Improving DAMON (only brainstorming)

- DAMON's accuracy and overhead could be more optimized
 - Adaptive monitoring attributes adjustment and regions splitting
 - Find too stable or too unstable regions and do more aggressive monitoring
 - Remapping regions based on monitoring results, to sorted by hotness
 - The spatial locality assumption of memory regions will be more reasonable
 - DAMON-internal address space would be needed for usual cases



Improving MM with DAMON (only brainstorming)

- DAMON might be able to be used to help
 - THP promotion/demotion
 - Page migration target (for compaction or CMA) selection
 - LRU pages prioritization
 - Tiered-memory management
- The works could fundamentally be done in two ways
 - Implementing new subsystems
 - Modifying existing subsystems
 - Any opinion or preference among these?
 - I guess it should be depend on each specific case, though...

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Summary

- DAMON/DAMOS helps you write fine-grained data access patternoriented light-weight kernel modules
- Such modules could be useful for enhancing memory efficiency
- There are many more things to do; Looking forward your contributions
- For more information
 - please visit https://damonitor.github.io, or
 - reach out to sj@kernel.org

Special Thanks To (Alphabetical order)

• I might missed someone's name, please forgive me...

Alexander Shishkin Amit Shah Andrew Morton **Brendan Higgins** David Hildenbrand **David** Rientjes David Woodhouse Fan Du Fernand Sieber Greg Kroah-Hartman **Greg** Thelen Jonathan Cameron

Jonathan Corbet Leonard Foerster Marco Elver Markus Boehme Maximilian Heyne Minchan Kim Paul E. McKenney Shakeel Butt Stefan Nuernberger Steven Rostedt Varad Gautam Yunjae Lee

Questions?

- You can also
 - visit https://damonitor.github.io, or
 - reach out to sj@kernel.org

https://kids.nationalgeographic.com/content/dam/kids/photos/animals/Birds/A-G/adelie-penguin-jumping-ocean.ngsversion.1396530997321.adapt.1900.1.jpg

0

Backup Slides

boilerplate

```
// SPDX-License-Identifier: GPL-2.0
#define pr_fmt(fmt) "ksdemo: " fmt
#include <linux/init.h>
#include <linux/kernel.h>
#include <linux/module.h>
static int __init ksdemo_init(void)
        pr_info("Hello Kernel Summit 2021\n");
        return 0:
}
static void __exit ksdemo_exit(void)
ł
        pr_info("Goodbye Kernel Summit 2021\n");
module_init(ksdemo_init);
module_exit(ksdemo_exit);
MODULE_LICENSE("GPL");
MODULE_AUTHOR("SeongJae Park");
MODULE DESCRIPTION("Kernel Summit 2021 live coding demo");
```

diff -u boilerplate wsse (1/4)

```
@@ -2,18 +2,69 @@
#define pr_fmt(fmt) "ksdemo: " fmt
+#include <linux/damon.h>
#include <linux/init.h>
#include <linux/kernel.h>
#include <linux/kernel.h>
+#include <linux/module.h>
+#include <linux/pid.h>
+
+ *static int target_pid __read_mostly;
+
*struct damon_ctx *ctx;
*struct pid *target_pidp;
[...]
```

diff -u boilerplate wsse (2/4)

```
\left[ \ldots \right]
+static int ksdemo_after_aggregation(struct damon_ctx *c)
+{
        struct damon_target *t;
        damon_for_each_target(t, c) {
                 struct damon_region *r;
                 unsigned long wss = 0;
                 damon_for_each_region(r, t) {
                         if (r->nr_accesses > 0)
                                  wss += r->ar.end - r->ar.start;
                 pr_info("wss: %lu\n", wss);
        return 0;
```

diff -u boilerplate wsse (3/4)

```
[...]
static int __init ksdemo_init(void)
 {
        struct damon target *target;
        pr_info("Hello Kernel Summit 2021\n");
        return 0;
        /* allocate context */
       ctx = damon new ctx(DAMON ADAPTIVE TARGET);
        if (!ctx)
                return - ENOMEM;
        /* specify that we want to monitor virtual address space */
       damon va set primitives(ctx);
        /* specify what process's virtual address space we want to monitor */
+
       target pidp = find get pid(target pid);
       if (!target pidp)
                return -EINVAL;
       target = damon_new_target((unsigned long)target_pidp);
       if (!target)
+
                return - ENOMEM;
       damon add target(ctx, target);
        /* register callback for reading results */
       ctx->callback.after aggregation = ksdemo after aggregation;
        /* start the monitoring */
        return damon start(&ctx, 1);
```

diff -u boilerplate wsse (4/4)



diff -u wsse prcl (1/2)



diff -u wsse prcl (2/2)

+

+

```
[\ldots]
@@ -53,6 +56,22 @@
        damon_add_target(ctx, target);
        /* register callback for reading results */
        ctx->callback.after_aggregation = ksdemo_after_aggregation;
        /* create the operation scheme specification */
        scheme = damon new scheme(
                        /* find regions having size >= PAGE_SIZE */
                        PAGE SIZE, ULONG MAX,
                        /* and not accessed at all */
                        0, 0,
                        /* for 30 aggregation interval (3 secs) */
                        30, UINT MAX,
                        /* and page out those */
                        DAMOS PAGEOUT.
                        &quota, &wmarks);
        if (!scheme)
                return - ENOMEM;
        damon_set_schemes(ctx, &scheme, 1);
        /* start the monitoring */
        return damon_start(&ctx, 1);
 }
```

Evaluation Environment

- Test machine
 - QEMU/KVM virtual machine on AWS EC2 i3.metal instance
 - 36 vCPUs, 128 GB memory, 4 GB zram swap device
 - Ubuntu 18.04, THP enabled policy madvise
 - Linux v5.15-rc1 based DAMON dev tree (The source tree is available)
- Workloads: 25 realistic benchmark workloads
 - 13 workloads from PARSEC3
 - 12 workloads from SPLASH-2X
- DAMON monitoring attributes: The default values
 - 5ms sampling, 100ms aggregation, and 1s regions update intervals
 - Number of regions: [10, 1000]

Evaluation Setup: DAMON

- Questions to Answer
 - How lightweight DAMON is?
 - How accurate DAMON is?
- Run 25 workloads from PARSEC3 and SPLASH-2X one by one on three different systems
 - orig: v5.15-rc1, thp for only 'madvise'
 - rec: orig + DAMON running for the workload's virtual address space
 - prec: orig + DAMON running for the entire physical address space
- Measure the workload's runtime and DAMON's CPU usage
- For more details in the setup, refer to backup slides

Evaluation Setup: DAMOS

- Questions to answer
 - How effective DAMOS is?
 - This also answers 'How accurate DAMON is?'
- Basically similar to that for DAMON
 - Run the 25 workloads and measure some metrics
 - Apply some DAMON-based operation schemes to the workloads