# Co-operative Hypervisor Caching based on Content Similarity

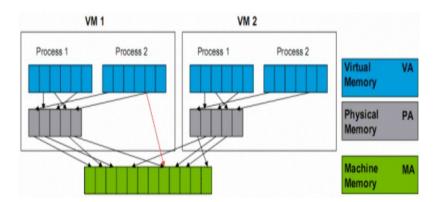
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11 August 2016

## Memory Virtualization

- ✓ Virtualization
  - maximize utilization of resources
- ✓ Memory overcommitment
  - to collocate more VMs



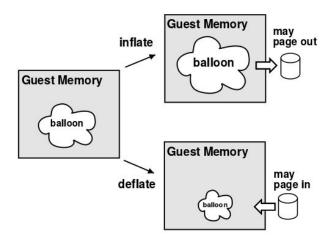
## Memory Virtualization

#### ✓ Memory

- slowly "renewed"
- useful in large granularity
- o inertia

## Techniques of Memory Overcommitment

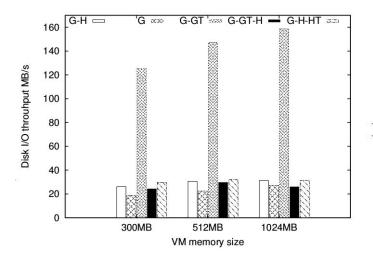
- ✓ Demand Paging by Hypervisor
- ✓ VM Migration
- ✓ Ballooning
- ✓ Content Based Page Sharing



## Hypervisor caching

- a virtualized memory management technique
- memory controlled by hypervisor
  - used for the benefit of VMs without transferring ownership
  - used as optimization features that enhances VM performance
    - second chance exclusive cache for VM page-cache that reduces disk IO
    - in-memory swap disk for anonymous pages of a VM
  - freedom to implement custom global policies easily
    - compression, content based sharing
- can complement other techniques

## Related Work [13]

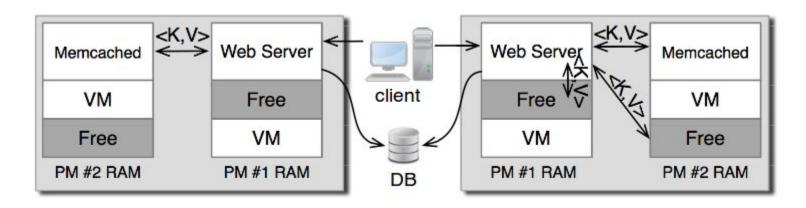


Performance metric	Performance		
Disk I/O throughput	6x more		
Disk read size	20x lower		

Effectiveness of G-GT compared to G-H for read intensive workloads

#### Related Work

- ✓ 64% 93% of all shareable pages of co-hosted VMs are page-cache pages
  [10]
- ✓ Mortar [7] -
  - o tried make use of hypervisor caches of all PMs in a datacenter for the benefit apps in VM



#### Motivation

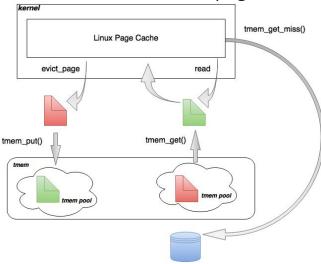
- ✓ Previous results
- ✓ Data centers
  - secondary storage accessed over network
- ✓ Presence of similar content
  - similar applications running in VM
  - common files being accessed
  - Booting VMs from same template/image

#### **Problem Statement**

- ✓ Design and implementation of a hypervisor cache, as a second chance exclusive cache for page-cache.
- ✓ Do content based page sharing to increase utilization.
- Pursue page sharing opportunities among peers in other physical machines when under memory pressure.
- ✓ Benchmark overheads of doing remote page sharing

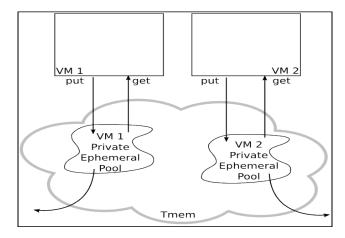
## Transcendent memory

- ✓ A hypervisor caching mechanism
  - o provision to be explicitly used as a second chance cache for page-cache
  - o page-copy based interface to store & retrieve pages



#### Tmem Pools

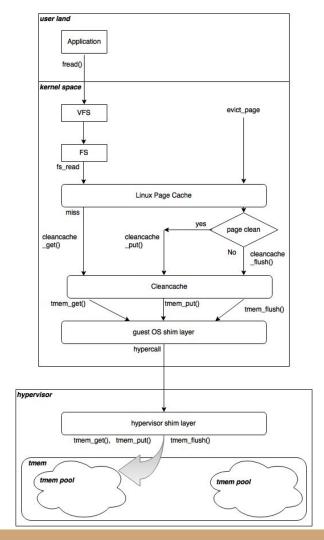
- ✓ To use tmem backend
  - o VMs (clients) create pools
- ✓ Different semantics
  - Ephemeral, Persistent



flags	Ephemeral	Persistent
Private	Private to each VM. But memory can be reclaimed from this any moment. Hence pages successfully put to an ephemeral pool may or may not be present later when the client kernel uses a subsequent get with a matching handle.	Private to each VM. Pages successfully put to a persistent pool are guaranteed to be present for a subsequent get.
	to an ephemeral pool may or may not be present later when the client kernel uses a subsequent get with a	

## Tmem frontends

- ✓ source of data
  - cleancache
- ✓ Tmem API
  - TMEM\_PUT\_PAGE(poolid, objectid, pageid, pfn)
  - TMEM\_GET\_PAGE(poolid, objectid, pageid, pfn)
- ✓ item identifier in tmem cache
  - <poolid, objectid, pageid>



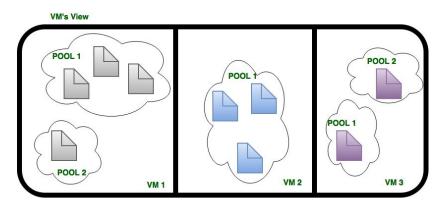
#### Tmem backends

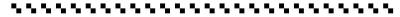
- ✓ Different ways of implementing tmem cache
  - Xen tmem backend
  - zcache
  - RAMster
  - KVM tmem backend

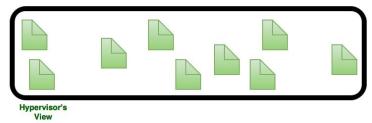
## Overview of related work

	optimizations ba	generic, application agnostic	
	local	global	solution
Mortar	0	0	0
zcache	0	0	Yes
RAMster	0	0	Yes
Xen tmem	Yes	0	Yes

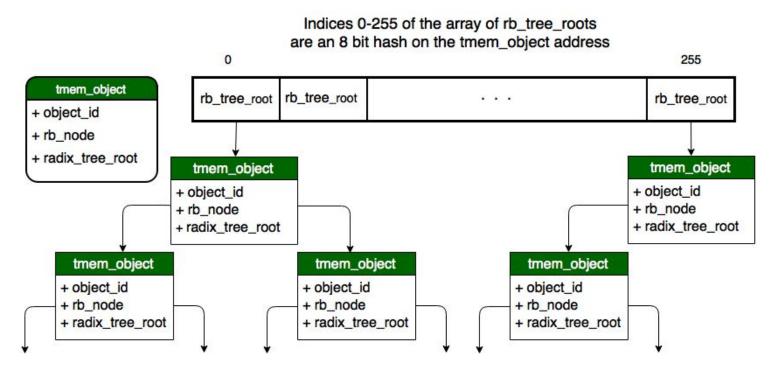
## Design



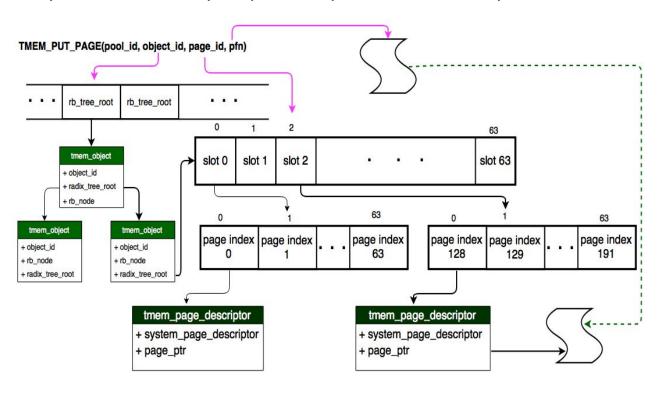




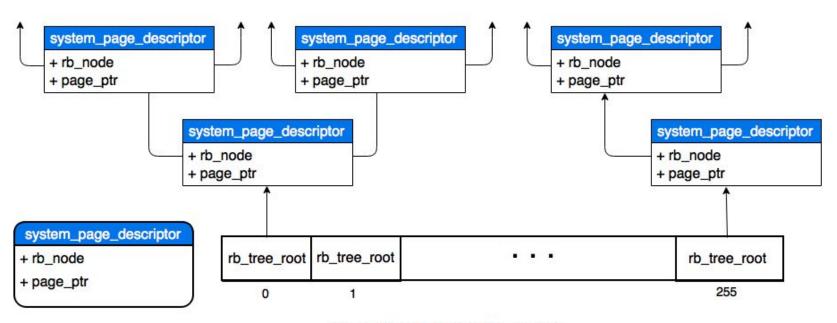
## Implementation specifics - A VM tmem pool



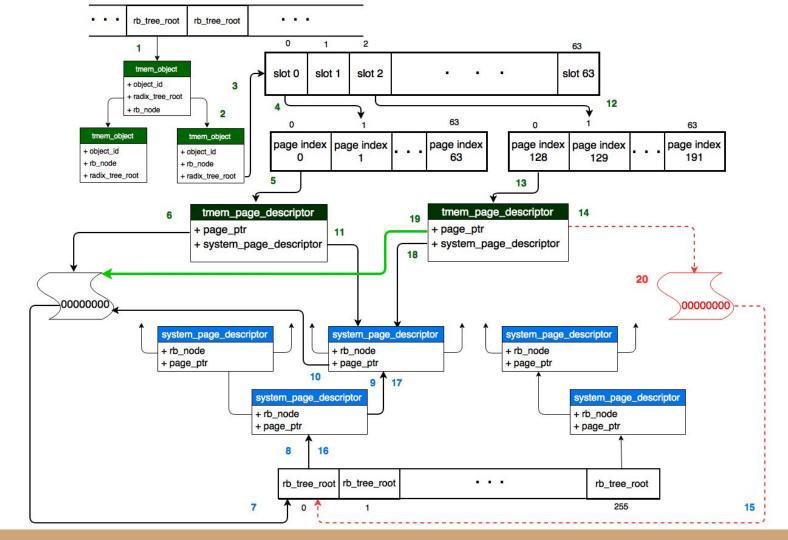
## Implementation specifics - a put into a VM's pool



## Implementation specifics - Hypervisor's view



The indices 0-255 of the array of rb\_tree\_roots are first byte of page content



## Co-operative (distributed/remote) de-duplication

#### ✓ Questions

- When to do remote de-duplication?
- Where to look?
- What are network overheads of doing remote de-duplcation?

## When to remote de-duplication?

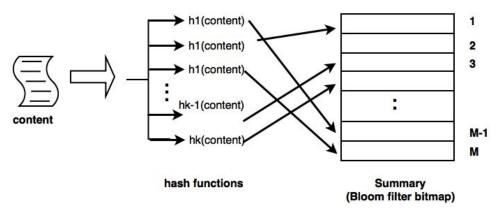
- ✓ If memory is available hold on to contents
  - Avoid unnecessary network delays/overheads
- ✓ Evict on memory pressure in hypervisor
  - If remote match found, well and good
  - else goes well with the ephemeral semantics of the use case (cleancache)

## Where to look & overhead of this search over network.

- Ask around each co-operating backend?
- ✓ Overhead
  - H, average cache hit ratio in each host
  - N, no. of hosts is N
  - R, avg. no. of requests received
  - $\sim$  (N 1)(1 H)R, no. of requests each host has to handle
  - $\circ$  (N)(N 1)(1 H)R, requests in all
  - If N increases, there can be quadratic increase in no. of requests

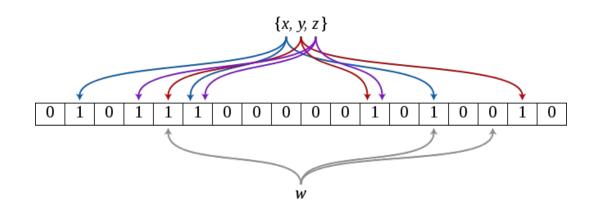
## Inspiration

- ✓ Summary Cache: A web cache sharing protocol [3]
  - Makes use of a memory & time efficient data structure to store contents of other proxies
    - ➤ Bloom filters
    - Avoids multicast queries among co-operating proxy caches while looking for similar content



## Looking up the bloom filter

- ✓ Says that there is a probability of finding the content remotely
  - there can be false positives
    - probability of false positive (1 (e ^ (-kn/m) ) ) ^ K
  - free from false negatives if there are no removals



## Decisions while using bloom filters

- ✓ Choosing the bitmap size
  - to reduce false positives
- Frequency of bloom filter updates
  - to reduce staleness of information
    - can cause false misses & false hits
    - false misses = missed opportunity to do remote sharing
    - > false hits = incurs network overhead only to find content no longer exists

## Some bloom filter stats for our use

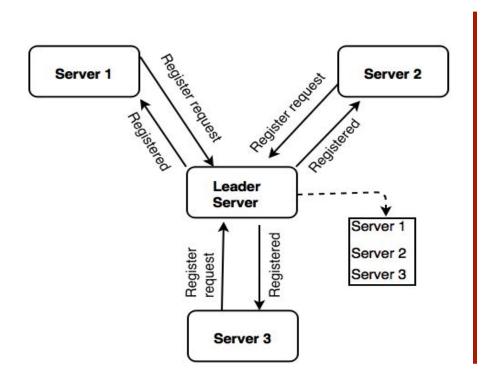
Memory of a VM (GB)	Pages	Summary pages (N)	Bit slots in bloom filter (M)	M (MB)	Total size of all bloom filters (GB)	Hash functions (K)	Probability of false positive (1-e^(-KN/M))^K
		2 2,097,152	268,435,456	32	0.5	2	0.0002
0.5 131,072						4	0.0000008
	131 072					8	0.0000000001
	131,072		33,554,432	4	0.0625	2	0.0138
						4	0.0024
						8	0.0006

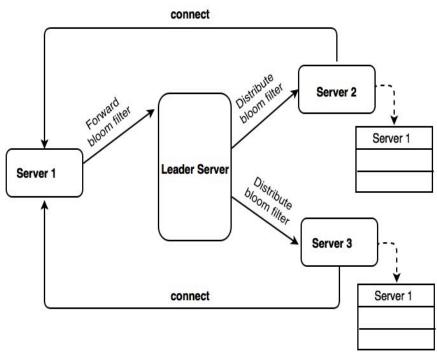
Memory of a VM (GB)	Pages	Summary pages (N)	Bit slots in bloom filter (M)	M (MB)	Total size of all bloom filters (GB)	Hash functions (K)	Probability of false positive (1-e^(-KN/M))^K
		16 777 216	268,435,45 6	32	0.5	2	0.0138
4 1,048,57						4	0.0024
	1 049 576					8	0.0006
	1,040,570	10,777,210	33,554,432	4	0.0625	2	0.3996
						4	0.5590
						8	0.8625

## Bloom filter information staleness

- ✓ Not a primary concern for us
  - o a kernel thread exchanges bloom filters periodically with a leader server
  - o a leader server takes care of forwarding bloom filters to others

## Set up of the co-operative network of hypervisors

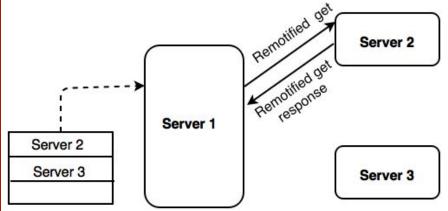




## Remote de-duplication (*remotification*)

## Server 2 Server 1 Server 2 Server 3 Remotification Server 3

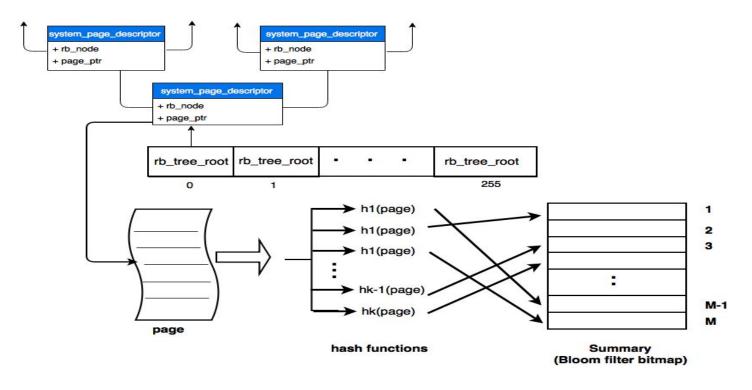
## Remote retrieval (remotified get)



## Extending local de-dup design

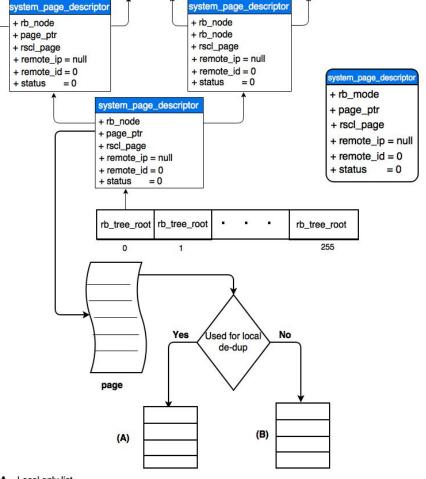
- ✓ Which all pages to be remotified?
  - o exempt those used in local de-dup
- ✓ How to maintain state?

## Implementation specifics - Populating the bloom filter



## Maintaining state of pages held

- ✓ Local only list (lol)
  - holds pages used for local de-dup
    - exempted from remote de-dup
- ✓ Remote sharing candidate list (rscl)
  - candidate pages for remote de-dup



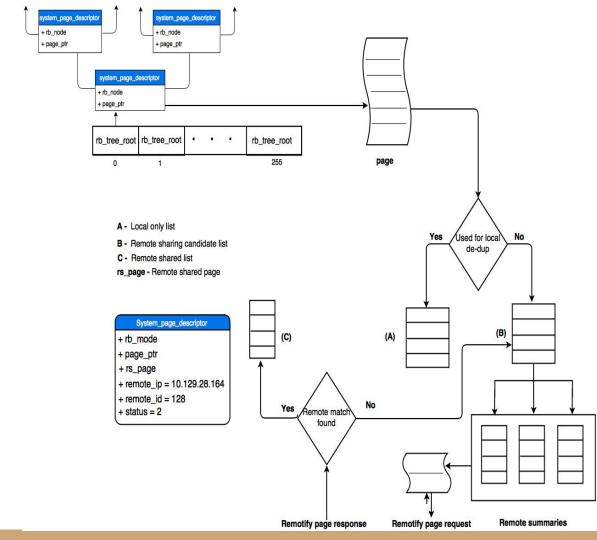
A - Local only list

B - Remote sharing candidate list

rscl\_page - Remote sharing candidate list page

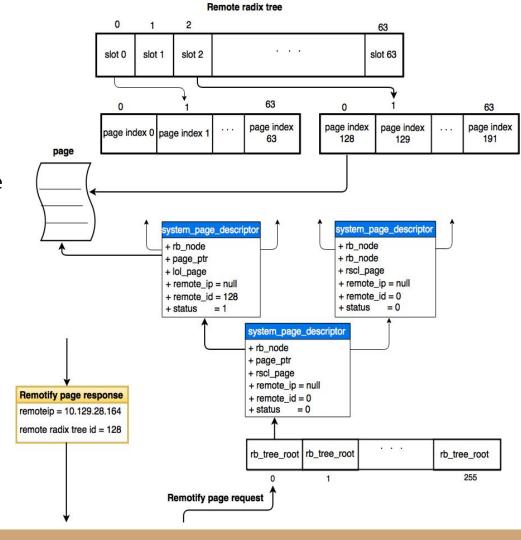
## Remotification on eviction

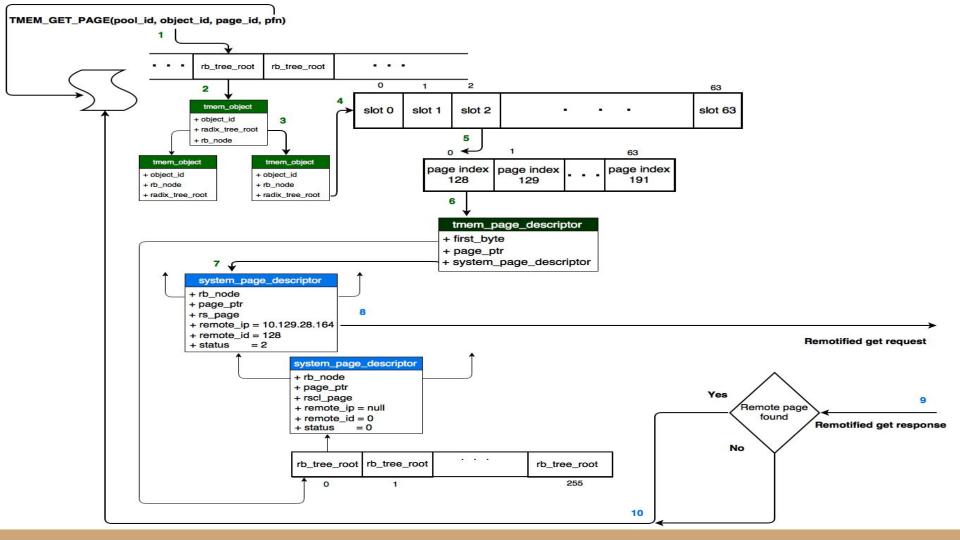
- ✓ Remote Shared List (rsl)
  - evicted pages' reference



## Handling remote de-duplication

- ✓ Remote Radix Tree
  - pages used to de-dup remote page
    - > returns an index within it
- moved to local only list
  - prevents recursive remote de-dup





## Experiments & Evaluations

- ✓ Correctness verification
  - local de-duplication
  - remote de-duplication
- Evaluation of runtime overheads
  - synthetic read intensive workload
  - local de-dup only mode
  - local & remote de-dup mode
- ✓ Micro benchmarking of tmem operations
  - same synthetic read intensive workloads
  - local & remote de-dup mode

## **Experiment Setup**

- ✓ 3 machines.
- ✓ Machine A with 4 Intel Core i5-4440 3.10 GHz CPUs, 8 GB RAM
- ✓ Machine B with 4 Intel Core i7-3770 3.40 GHz CPUs, 8 GB RAM;
- ✓ Machine C with 4 Intel Core 2 Quad Q9550 2.83 GHz CPUs, 6 GB RAM.
- ✓ All three booted a custom Linux kernel based on linux-4.1.3.
- ✓ Machines B and C hosted 1 VM each using KVM.
- ✓ The VMs were configured to boot with 512 MB RAM and had all other configurations same.
- ✓ For remote de-dup experiments Machine A acted as the leader server

# 1. Correctness verification - Local de-dup

### ✓ Question

 Whether duplicate pages are being correctly identified and the redundant copies being correctly removed from the tmem backend store?

### ✓ Experiment Setup

- Workload
  - copying a file of 1GB full of 1s to /dev/null
  - ➤ 1 run
- VM configurations
  - configured with 0.5 GB memory

#### ✓ Observation

#pages that were successfully de-duplicated = 1 - #pages of file put into backend

## 2. Correctness verification - Remote de-dup

### ✓ Question

 Whether matches for pages coming in from a remote backend can be found out and de-duplicated. Also check whether all such pages that were remotified be retrieved successfully. i.e. check the correct working of *remotification* and *remotified get*.

### ✓ Experiment Setup

- Workload
  - copying a file of 1GB full of random content to /dev/null
  - ➤ 2 runs
- o 3 PMs
  - Machine A leader server, Machine B & C hosts VMs involved
  - Machine B does not evict its pages
- o 2 VMs
  - ➤ 1 each on machine B, Machine C with 0.5 GB memory

# 2. Correctness Verification - remote de-dup

- All pages of random file that were evicted from Machine C were successfully de-duplicated at Machine B in run 1
- All pages of random file that were evicted from Machine C in run 1 were succefully retrieved from Machine C in run 2
- Remotification & remotified gets work correctly

## 3. Evaluation of runtime overheads - Local de-dup only mode

### ✓ Objective

 The overhead of a tmem backend that does local de-dup on end-end delay of a synthetic read intensive workload

## ✓ Experiment Setup

- Same as experiment 1
- File in VM 1 GB rand file
- o #runs 2
- ✓ Observation

	Cold	Hot
Mean Runtime	15.305	2.464
Std Deviation	0.475	0.028

Table 6.1: Effects of hot & cold tmem caches in local de-dup only mode on a synthetic workload in a VM hosted in machine B. Runtime is specified in seconds. Base case mean 14.456s. The results were obtained over 100 runs.

## 4. Evaluation of runtime overheads - Local & Remote de-dup mode

## ✓ Objective

 The overhead of a tmem backend that does both remote & local de-dup on end-end delay of a synthetic read intensive workload

### ✓ Experiment Setup

Same as experiment 2

	Cold	Hot		
Mean Runtime	15.724	32.759		
Std Deviation	0.688	2.194		

Table 6.2: Effects of hot & cold tmem caches in local & remote de-dup mode on a synthetic workload in a VM hosted in machine B. Runtime is specified in seconds. Base case mean 14.456s. The results were obtained over 100 runs.

# 5. MIcro benchmarking of tmem functions - local de-dup only mode

## ✓ Objective

 Benchmark the run-time overheads of individual operations in tmem in terms of CPU cycles excluding the cycles consumed for VMEntry & VMExit

### ✓ Experiment Setup

- Same as experiment 3
- Files in VM 1 GB rand file, 1 GB one file

## 5. Micro benchmarking of tmem functions - local de-dup only mode

Operation	CPU Cycles	Total #
<pre>kvm_host_get_page (hits)</pre>	$16143 \pm 10257$	263031
<pre>kvm_host_get_page (miss)</pre>	8745 ± 1951	264676
kvm_host_put_page	$20859 \pm 7278$	262752
local de-duplication(succ)	0	0
local de-duplication(fail)	$8138 \pm 2236$	262752

Table 6.3: Table depicting the overhead of tmem functions in terms of CPU cycles when the tmem cache does only local de-duplication. Test used the *rand file*. get miss overheads were separately calculated without populating the tmem cache.

## 5. Micro benchmarking of tmem functions - local de-dup only mode

Operation	CPU Cycles	Total #
<pre>kvm_host_get_page (hits)</pre>	$7440 \pm 6037$	263166
<pre>kvm_host_get_page (miss)</pre>	$9014 \pm 2026$	278397
kvm_host_put_page	$23655 \pm 9137$	262753
local de-duplication (succ)	$10048 \pm 2825$	261381
local de-duplication (fail)	$8325 \pm 4098$	1372

Table 6.4: Table depicting the overhead of tmem functions in terms of CPU cycles when the tmem cache does only local de-duplication. Test used the *one file*. get miss overheads were separately calculated without populating the tmem cache.

## ✓ Objective

 Benchmark the run-time overheads of individual operations in tmem in terms of CPU cycles excluding the cycles consumed for VMEntry & VMExit

### ✓ Experiment Setup

Same as experiment 4

CPU Cycles	Total #
$379232 \pm 387284$	258503
0	0
$107007 \pm 241533$	258036
$960450 \pm 76539$	155316
0	0
$623392 \pm 305216$	152256
0	0
	$379232 \pm 387284$ 0 $107007 \pm 241533$ $960450 \pm 76539$ 0 $623392 \pm 305216$

Table 6.5: Table depicting the overhead of tmem functions in terms of CPU cycles when the tmem cache does both local & remote de-duplication.

Operation	time in ms
<pre>kvm_host_get_page (hit)</pre>	0.77
<pre>kvm_host_get_page (miss)</pre>	0
kvm_host_put_page	0.34
remotify_page (succ)	1
remotify_page (fail)	0
remotified_get_page (succ)	0.92
remotified_get_page (fail)	0

Table 6.6: Table depicting the max possible overhead of tmem functions in terms of time in ms when tmem cache does both local & remote de-duplication. The frequency of CPU is assumed to be 1GHz

✓ Comparing with std values of network disk access [11]

Parameters	Value
Model	Seagate 39102FC
Interface	Fibre Channel
Capacity	9.1 Gbytes
Cache size	1 Mbyte
Rotational speed	10,025 RPM
Avg. rotational time	3.0 ms
Seek time	Read 5.4 ms, write 6.2 ms
Internal transfer rate	19.0-28.4 MB/s

■ **Table 1.** *Disk parameters.* 

	Read (ms)						
Configuration	1 kB	4 kB	16 kB	64 kB			
SAN	9.04	9.19	10.21	14.38			
GigE LAN iSCSI	9.57	9.7	10.91	15.82			
Campus LAN iSCSI	11.37	12.45	14.33	24.2			

■ **Table 2.** *Latency under light load; kB: kilobytes.* 

✓ Comparing with std values of network disk access

Data size	1 kB (ms)		4 kB (	4 kB (ms)		(ms)	64 kB	(ms)	256 k	(ms)
	Avg	Std	Avg	Std	Avg	Std	Avg	Std	Avg	Std
iSCSI read	18.5	27.1	20.5	25.4	34.8	9.0	49.1	10.5	93.5	14.6
SMB read	19.1	28.4	22.1	25.1	40.0	8.8	62.3	16	125.1	19.4

Data size	1 kB (ms)		4 kB (ms)		16 kB	(ms)	64 kB	(ms)	256 k (	ms)
	Avg	Std	Avg	Std	Avg	Std	Avg	Std	Avg	Std
iSCSI read	4.36	3.6	4.43	4.4	7.13	3.7	19.89	3.5	61.04	5.3
NFS read	9.00	2.4	9.80	2.1	12.07	2.2	25.63	2.8	75.34	9.3

## Conclusions & Future Work

#### ✓ Conclusions

- o Implemented a tmem backend that does local & remote de-duplication
- First steps towards benchmarking overheads associated with remote operations

#### ✓ Future work

- compare overheads of VMEntry & VMExit with tmem operations
- tests to be carried out with realistic workloads.

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