



# CumulusDB: Cloud-Native Databases and Unikernels

A Vision for Kernel-Integrated Application Co-Design

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Technische

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## ⇒ The Anabasis: Layers all the Way Down



- Modern hardware is tremendously capable
  - Up to ~100 cores, 100s of GiB DRAM
  - >1M 4KiB-random reads/s, 100/25G network
  - It is hard to fully exploit it



Bare-Metal Hardware 96 CPUs, 512 GiB NVMe SSDs, 25G Network

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  - Virtual machines isolate customers



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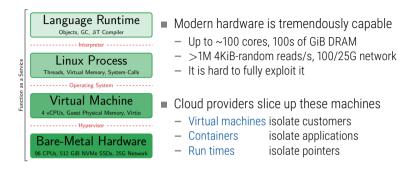


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  - Virtual machines isolate customers
  - Containers isolate applications



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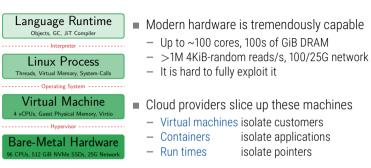
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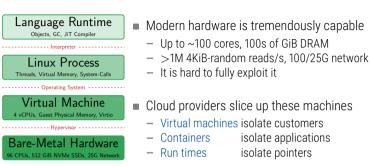
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- Benefits for average applications
  - Simpler to develop and to deploy
  - + Cloud providers can co-locate more customers
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"Anabasis: Der Zug der Zehntausen", Xenophon, 370 BCE

#### ⇒ But some applications are experts!

## H The Katabasis: From Traditional DBMS to CumulusDB



- Traditional Database Management Systems
  - Standard POSIX API tames the hardware zoo
  - Operating system manages resources
  - Fast enough for spinning disks

#### **Traditional DBMS**

| client job<br>= OS thread | manual<br>memory<br>managment | blocking<br>storage I/O | blocking<br>networking |  |  |  |
|---------------------------|-------------------------------|-------------------------|------------------------|--|--|--|
| pthreads                  | mmap                          | read, write             | sockets                |  |  |  |
| General-Purpose OS        |                               |                         |                        |  |  |  |
| threads,<br>scheduler     | virtual memory                | NVMe driver             | network driver         |  |  |  |
|                           |                               | sq⊖ ⊖cq                 | sq) Ocq                |  |  |  |
| Hardware                  |                               |                         |                        |  |  |  |
| Hardwai                   | re 🛛                          |                         |                        |  |  |  |

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- Modern (High-Performance) DBMSes
  - I/O and Network became too fast for OS
  - User-Space: task queues, disk cache, memory
  - Kernel bypass required to exploit SSDs

#### Modern DBMS + OS Bypassing

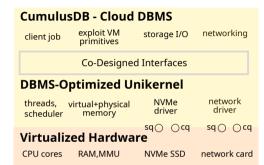
| worker thread<br>= OS thread<br>= HW thread | l manual<br>memory<br>management | asynchronous<br>storage I/O | asynchronous<br>networking |  |
|---|----------------------------------|-----------------------------|----------------------------|--|
| pthreads                                    | mmap                             | SPDK                        | DPDK                       |  |
| General-                                    | Purpose OS                       | (user-space<br>storage I/O) | (user-space<br>networking) |  |
| threads,<br>scheduler                       | virtual memory                   |                             |                            |  |
|   |                                  | sq) Ocq                     | sq O O cq                  |  |
| Hardware                                    |                                  |                             |                            |  |
| CPU cores                                   | RAM,MMU                          | NVMe SSD                    | network card               |  |

# ⇒ The Katabasis: From Traditional DBMS to CumulusDB



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### **CumulusDB** – A Kernel-Integrated DBMS for the Cloud

- Unikernel Principle: Melt OS and DBMS together, hypervisor brings isolation
- Target Platform: Virtualized hardware is a uniform and stable ABI (x86, NVMe, virtio)
- Kernel Integration: Vertically-integrated management of all resources



 $\exists$  Benefits of Kernel Integration



Kernel integration gives the DBMS access to privileged operations/interfaces

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### **Computation & Scheduling**

- Manipulate IRQ-vector tables
- Block IRQs, Send IPIs, Shutdown CPUs
- Goal: Query-plan-aware task/thread scheduling



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- Concurrent Lock-Free Page-Table Access
- Partially inconsistent TLB-states
- **Goal**: Virtual-memory as an active abstraction

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### Hypervisor Interaction

- Hypercalls for synchronous signals
- HV-inspected shared memory regions
- **Goal**: Elastic Resource Allocation for VMs



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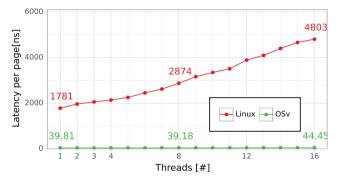


- Check if a virtual page is present
  - VM-based buffer managers[3]
  - OS treats VM as implementation detail
- Linux: /proc/\*/pagemap interface
  - Accesses via read(2)
  - Architecture-independent format
  - Unikernel: Shared MMU Structures
    - Lock-Free Page-Table Walk
    - Access to Physical Addresses[6]

∀ Virtual-Page−Presence Check



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Host: AMD EPYC 9554P processor (64 cores, 128 HW threads, 384 GiB DRAM) Virtual Machine: 16 cores, 12 GiB DRAM, QEMU, 4 GiB VMA Workload: Random 4KiB Page

# ⅔ Virtual-Memory-based Database Snapshots



### **Use-Case Scenario**

```
DB *G; // Database
void olap(){ // 1 OLAP thread
  D = snapshot_create(global);
  res r = olap_scan(D);
  snapshot_destroy(D);
}
void oltp(){ // N OLTP threads
  while (1) {
    G[rand()]->modify();
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- Copy-on-Write Snapshots
   Consistent of VM area
  - Analytics on read-only copy

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### <u>Linux</u>

- Process-based snapshots [2]
  - fork() new process
  - Analytics in second process
  - Copy-on-Write
- During the copy
  - Single-threaded PT copy
  - OLTP threads have to block
- During the Analysis
  - TLB-shootdown storm
  - OLAP slows down OLTP



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## <u>CumulusDB</u>

Fine-Grained VM Snapshot [8] void \*snapshot\_create (addr, length);

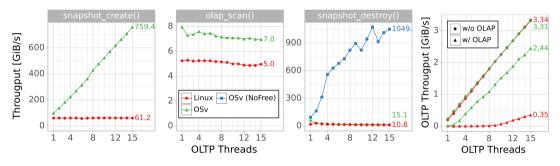
### Ad-Hoc Parallelization

On CoW pagefault, the OLTP threads help an ongoing snapshot to copy page tables.

- Reader-Side TLB invalidation
  - No TLB Shootdown
  - CPU-local TLB-entry flush before every OLTP page access



Host: AMD EPYC 9554P processor (64 cores, 128 HW threads, 384 GiB DRAM, 1 NUMA domain) Virtual Machine: 16 cores, 12 GiB DRAM, QEMU, 4 GiB Snapshot Area



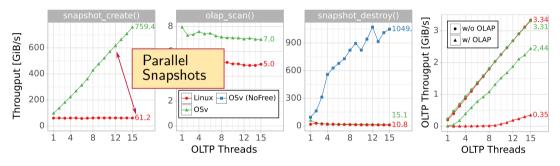
(a) Phases of an OLAP Job on an Copy-on-Write Snapshot

(b) Impact on OLTP Operations

Figure 2: Snapshot Copy-On-Write Benchmark



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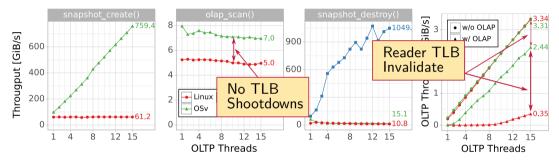
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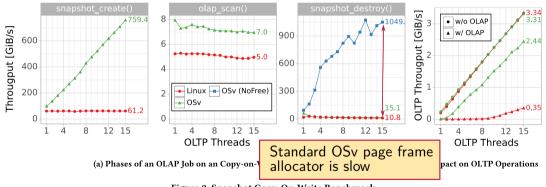
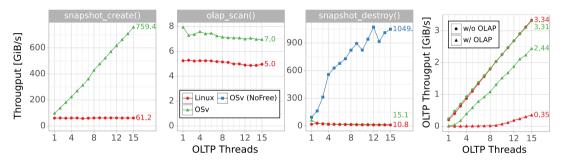


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More Details in our VLDB'24 Vision Paper[4]

## Related DBMS-OS Co-Design Projects

- **DBOS** A DBMS-oriented Operating System
  - OS components sit on top of distributed database
  - Each node runs a minimal microkernel (DBOS-brick)
  - DBOS is a cloud orchestrator. CumulusDB runs on a single node.

MxKernel – Runtime System for Heterogeneous Many-Core Systems Osnabrück, Dortmund [7]

- Run-to-completion tasks, Dynamic system partitions (habitats, cells)
- Kernel-application boundary, Isolation domains, RPC between components
- MxKernel aims for heterogeneous systems, CumulusDB targets the unified cloud environment
- **COD** Open up the OS for the DBMS
  - Problem: DBMS lacks knowledge that the OS already has.
  - Resource-allocation protocol between OS and DBMS
  - COD transports information, CumulusDB forwards hardware access

still missing

Stanford, MIT, Google, VMware [5, 9]







## ⊰ Summary

- The cloud attracts abstractions layers like a lamp on midsummer night
  - Good for the average application and its developer (not for his purse)
  - Database management systems are not the average application!
- **CumulusDB**: A Cloud-Native DBMS based on Kernel-Integration
  - Combine a Unikernel and a DBMS into a single VM image without isolation
  - Vertical-integrated resource management and privileged hardware access
  - The virtualized hardware is a portable machine model



### New Primitives for the DBMS

- Page-Table Walk
- Ad-hoc parallelization:
- Joint TLB management:

Directly access MMU data for in-core check

- Instead of blocking, others help completing the snapshot
- Distribute the chores of TLB management between reader and writer

## Advisement Block



## We're hiring! If you're interested in doing an PhD on CumulusDB, get in touch!



## References I



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- [2] Alfons Kemper and Thomas Neumann. "HyPer: A hybrid OLTP&OLAP main memory database system based on virtual memory snapshots". In: ICDE. 2011. DOI: 10.1109/ICDE.2011.5767867.
- [3] Viktor Leis, Adnan Alhomssi, Tobias Ziegler, et al. "Virtual-Memory Assisted Buffer Management". In: Proceedings of the ACM SIGMOD/PODS International Conference on Management of Data. Seattle, WA, USA: ACM, June 2023. DOI: 10.1145/3588687.
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- [6] Yannick Loeck and Christian Dietrich. "Evaluation and Refinement of an Explicit Virtual-Memory Primitive". In: IEEE Access 11 (Dec. 2023), pp. 136855–136868. DOI: 10.1109/ACCESS.2023.3338149.



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