# Exploring Computational Storage for mixed HPC Simulation and AI/ML Workloads at LANL

LA-UR-xxxxxx

Transforming Weapons Performance Calculation and other Mission Workloads via Efficiency Mission-Centric Computing Consortium

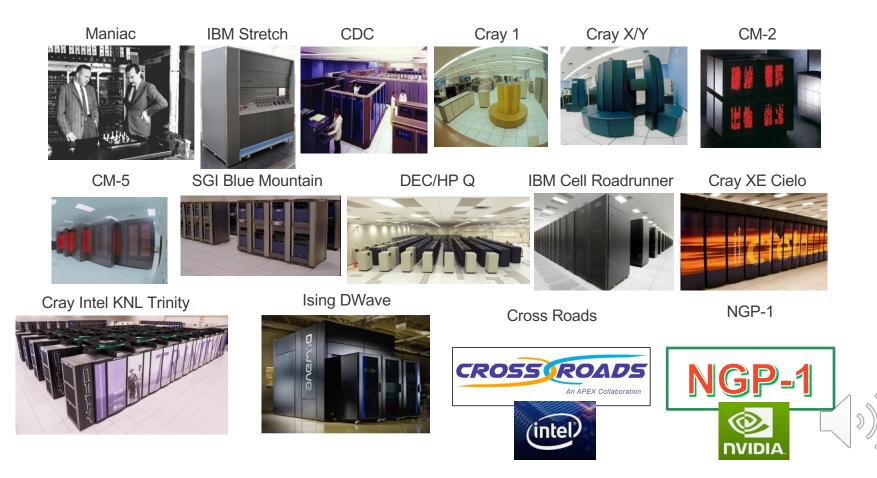
**Gary Grider** 

08/2021

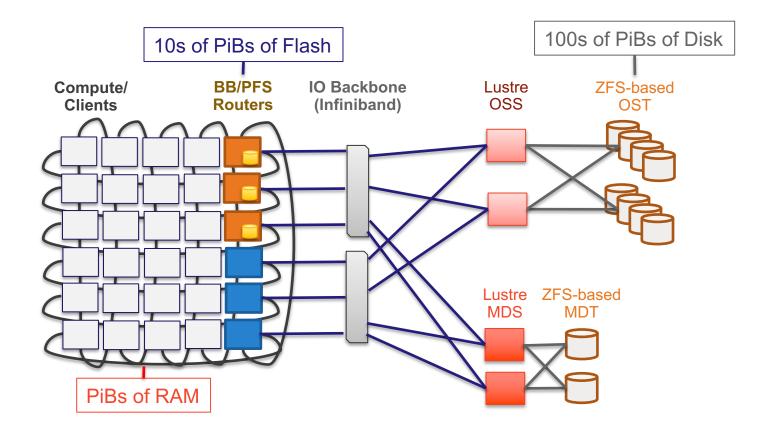




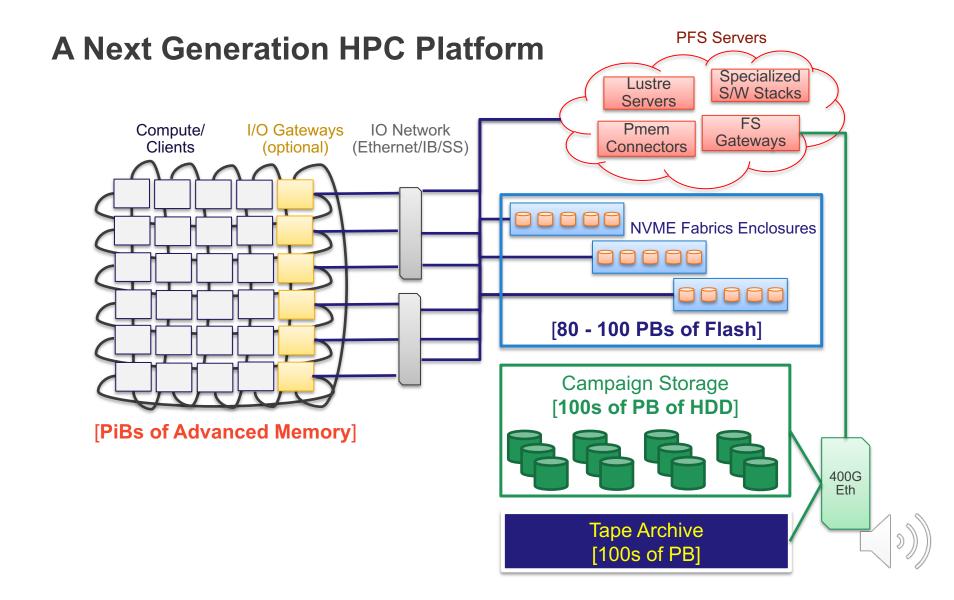
#### Nine Decades of Production Weapons Computing to Keep the Nation Safe



#### **Current HPC Platforms**







#### Why computational storage?

#### LANL mission ~= Weapons Science / \$

Lets shrink the \$



#### Economics for leveraging modern storage device trajectory

Considerations

- Cap/bw/iops of devices flash bw and iops per capacity is orders of magnitude different than disk
- Servers poor memory bw (just reading from network and writing to device can use ½ memory bw leaving little for erasure/encoding/compression/indexing/etc)
- Kernels/thick IO stacks in compute node client and server make getting IOPS extremely hard
- Network speeds/messaging rates quite astounding
- LANL simulation workload is not friendly with locality, so on compute node or near compute node storage is likely to lead to imbalance/stranding/etc. This is not same for other national labs!
- Leveraging industry trains, Flash, NVME, NVMEoF, RDMA, Smart Nic, Computational Storage, custom SOC etc.

Go after repetitive data agnostic use cases (within byte streams/file systems/etc.)

- Fixed functions like compression, erasure, encoding, dedup
- Fixed functions allow for customized hardware/software/pipelines and take advantage of locality (where the data is (computational storage) (where the data will be (computation in networks))

Find ways of reducing stack thickness to enable extracting performance (IOPS in this case as BW can be extracted with existing thick stacks)

 User space direct access from compute node to storage device (eliminate compute node kernel and server stack)

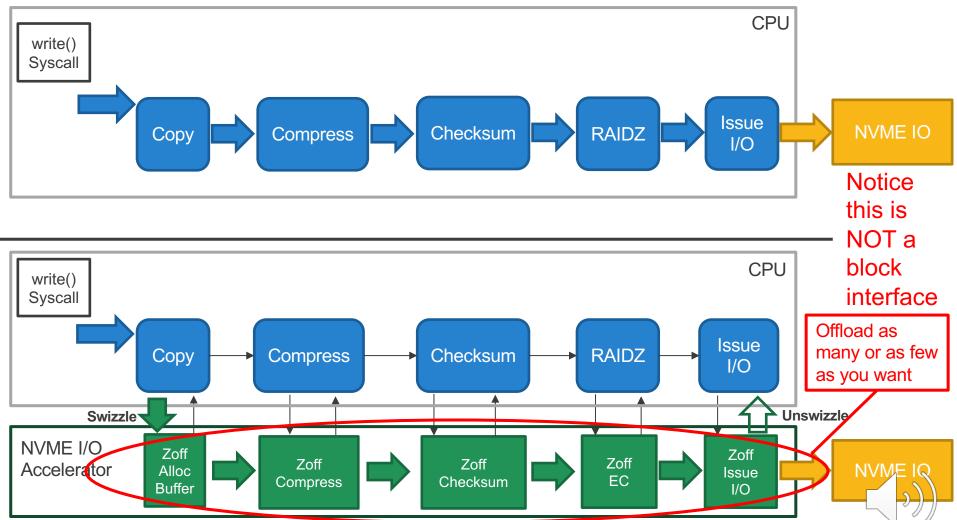
### **File System Services Offload**

## Data Agnostic fixed function offloads

- Non-obvious requirements
  - Require transparent data placement for disaster recovery
  - Require parallel file system support
  - Not just Read in a mixed simulation/AI/ML site Write-dominant workload for simulation (defensive I/O: write once, read never) still are important
- Computational Storage Benefits/Opportunities
  - Increase compression rates from 1.06:1 -> 1.3:1 for scientific data
  - Enable expensive coding/decoding to protect against correlated failures
  - Achieve higher per-server and per-device bandwidths
  - Lower server costs and quantities
- Overcome poor server memory BW imbalance
- Less expensive file oriented solution
- Use a commonly used HPC file system to leverage offload (ZFS)







#### Economic Model Using Measured/Specified Performance/Price for Offloading or Not (does offloading \$add up)?

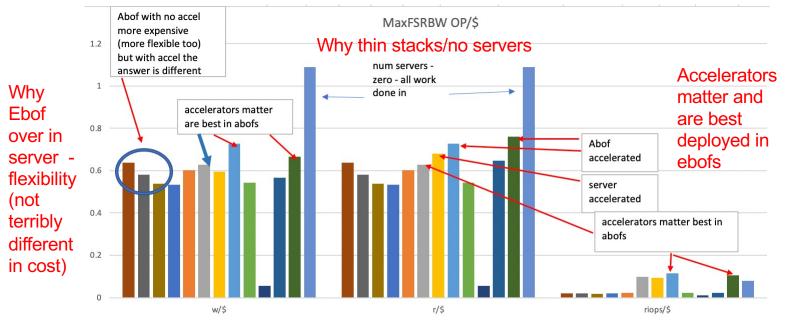
		r a s e r w G	r a w s r r G	f s w b w e e	f s w b w e e	f s w b w e e	t h r i o p	t h - w i o p	n v m e s I	\$ 1 ,	f s r b w e e	f s r b w e e	f s b w e	t	change what is in yellow ONLY, check the edit on min capacity to get min bw, copy lines below entirely and change only the yellow settings on each line
	-	В	В				M	м	0	0		-		У	
	T B	/ s	/ s	n c	l c	h c	/ s	/ s	t s	0	n c	l c	h c	p e	
system memory TB	1000	-	-		-	-	-	-			-	-			
nvme device TB	7.68	3.2	3				0.6	0.2		1.88					
srv0 (no servers)	ns	0	0		0	0						0	0	C	0 no srvs, nyme in ebofs, stg functions live in compute nodes or ebofs
srv1 2-dual400Gbit no stg	rs	45	45	32	28										1 srv with no slots
srv2 dual400 Gbit	rs	45	45		14		L 0.6				18	14			2 srv with slots
srv3 dual400 Gbit	rs	45	45		<b>A</b> 28		1.1		24		32	28			3 srv with slots (alternative schenario)
srv4accel dual400Gbit no stg	as	45	45							25	32	28			4 accel server with no slots
srv5accel	as	45	45	32	28	28	3 4.4	4.4	24	27	32	28		5	5 accel server with slots
srv6ebofaccel	rs	45	45		28									6	6 accel in ebof server with NO slots
ebof0 (no ebofs)	ne	0	0												0 no ebofs, nyme in srvs,stg functions in srvs
ebof1 2-dual400 Gbit 8Miop	re	80	80		60										1 ebof with slots with no offload would really need to use this if you use servers or accel servers or NO serv
ebof2accel 2-dual400 Gbit 8Miop	ae	80													2 accel ebof with slots with offload you could use this with non accel servers ONLY!
													value		e is poor uncompress on accelerators
serial bw sec dump 80% mem	600														
															iops background: intel test - so a hot dual socket or 28M iops from devices, running
sys cap type	0	1	2												6vm-servers per server got 13.5 M/iops or 1.15Mi ops/server through the network
sys cap requirement memories	8	16	32		1	if 1 you ha	ve enough cap	pacity to mee	t fswb	min <mark>if 0</mark>	then nee	ed more (	mems		but the above was with 4 25-gbit nics so mutiply by 4 to get roughly what dualport
	1	m l	h												400 Gbit (it doesn't look linear) chelsio dual 100 Gbit into a serverr demonstrated
comp type	0	1	2												2.8M iops through the server so its not scaling perfectly - but a 400 Gbit pcie-4
comp yealding .xx need	1	0.95	0.75												maybe 4Miops ebof has 4x iops of server due to double adapters and no kernel

#### Many Scenarios Considered

	m i n w	m a x w	m a x r b	m a x r i o				9	SERVER srv 2,3,5 accelera	rver ebof combo info, srv=0 only makes sense with ebof=1 or 2 means NO RVERS nvme in ebofs; srv 1,4 only makes sense with ebof=1 or 2 - nvme in ebofs; v 2,3,5 only makes sense with ebof=0 nvme in server; if you want to add celeration use srv=4 + ebof=1 (accel in srv nvme in ebof) -or- srv=5 + ebof=0 ccel and nvme in srv) -or- srv=1 + ebof=2 (srv with accel and nvme in ebof)									
	b	b	b	р															
goals	w	w	w	S															
	C	1	2	3															

					5	SA	M		.E	ON	ILY				<b>^</b>					scopario namina (auto
5 C e n a r i i	s r v t y p e	e b f t y p e	s y c a p t y p e	c o m t y p e	g o a I	t o t c t c a p B	n m v m e 1 0 0 0 5	t o t s r v 1 0 s	t o t b o f 1 0 0 s	f s w b w T B / s	- fsw bw TB/s	f r b w T B / s	fsrbwwTB/_s	r o p s G I O P / s	r i o p s G I O P / s	s r v c o s t \$ M	e b c s t M	n v e c o s t \$ M	t o t a I c o s t \$ M	scenario naming (auto generated) Server: ns – no servers rs – regular server as – accelerated server Ebof: ne – no ebof
rs2-24_ne0-0_mcap_ncmp_minwbw	2	0	1	0	0	15.00	7.50	3.13	0.00	9.38	-1.88	9.38	-13.13	1.25	-4.00	4.38	0.00	4.50	8.88	re – regular ebof
rs3-48_ne0-0_mcap_ncmp_minwbw	3	0	1	0	0	15.00	7.50	1.56	0.00	4.69	-6.56	4.69	-17.81	0.63	-4.63	2.19	0.00	4.50	6.69	ae – accelerated ebof
rs1-0_re1-24_mcap_ncmp_minwbw	1	1	1	0	0	15.00	7.50	0.44	3.13	1.33	-9.92	1.33	-21.17	0.18	-5.07	0.49	1.25	4.50	6.24	Capacity: I low, m med, h high
rs3-48_ne0-0_mcap_hcmp_minwbw	3	0	1	2	0	12.00	6.00	2.67	0.00	1.33	-7.67	2.67	-15.33	1.07	-3.13	3.73	0.00	3.60	7.33	Compression:
as4-0_re1-24_mcap_hcmp_minwbw	4	1	1	2	0	12.00	6.00	0.38	2.50	1.33	-7.67	1.33	-16.67	0.15	-4.05	0.70	1.00	3.60	5.30	l low, h high
as5-18_ne0-0_mcap_hcmp_minwbw	5	0	1	2	0	12.00	6.00	3.33	0.00	11.67	0.00	11.67	-6.33	1.33	-2.87	6.17	0.00	3.60	9.77	Scenario:
rs6-0_ae2-18_mcap_hcmp_minwbw	6	2	1	2	0	12.00	6.00	0.38	3.33	1.33	-7.67	1.33	-16.67	0.30	-3.90	0.42	2.83	3.60	6.85	Minwbw, maxy w
rs6-0_ae2-18_lcap_ncmp_maxriops	6	2	0	0	3	10.00	5.00	4.38	2.78	15.31	0.00	15.31	0.00	3.50	0.00	4.81	2.36	3.00	10.17	maxrbw, maxrbw
ns0-0_ae2-18_lcap_hcmp_maxriops	0	2	0	2	3	8.00	4.00	0.00	2.22	15.56	0.00	15.56	0.00	3.56	0.00	0.00	1.89	2.40	4.29	

Fewer servers and acceleration gives more fixed ops/\$ and using Ebof's gives more flexibility to match capacity/bw/iops and more upside potential (acceleration of fixed functions)

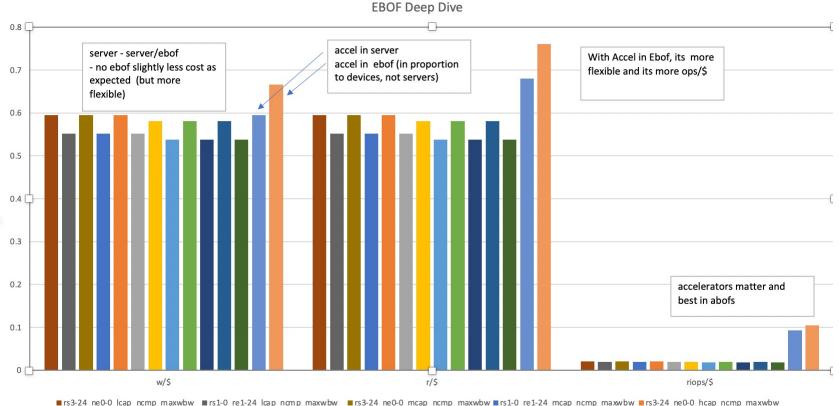


No servers has huge upside potential, user space compute node service talking directly to storage devices (over network) allows rightsizing capacity, bw, iops needed for task at hand. Servers/kernels make using device potential expensive.

rs2-12\_ne0-0\_mcap\_ncmp\_maxrbw = rs3-24\_ne0-0\_mcap\_ncmp\_maxrbw = rs1-0\_re1-24\_mcap\_ncmp\_maxrbw = rs3-24\_ne0-0\_mcap\_lcmp\_maxrbw
 as4-0\_re1-24\_mcap\_lcmp\_maxrbw = as5-24\_ne0-0\_mcap\_lcmp\_maxrbw = as5-24\_ne0-0\_mcap\_hcmp\_maxrbw = rs6-0\_ae2-20\_mcap\_lcmp\_maxrbw
 rs2-12\_ne0-0\_hcap\_lcmp\_maxrbw = rs2-12\_ne0-0\_mcap\_hcmp\_maxrbw = as4-0\_re1-24\_mcap\_hcmp\_maxrbw = rs6-0\_ae2-20\_mcap\_hcmp\_maxrbw
 ns0-0\_re1-24\_mcap\_hcmp\_maxrbw
 ns0-0\_re1-24\_mcap\_hcmp\_maxrbw



## Deeper Dive on No Ebof vs Ebof vs Abof Acceleration Near Data Wins



 Irs3-24\_ne0-0\_lcap\_ncmp\_maxwbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxwbw
 Irs3-24\_ne0-0\_mcap\_ncmp\_maxwbw
 Irs3-24\_ne0-0\_hcap\_ncmp\_maxwbw

 Irs1-0\_re1-24\_hcap\_ncmp\_maxwbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_mcap\_ncmp\_maxwbw

 Irs3-24\_ne0-0\_hcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_mcap\_ncmp\_maxrbw

 Irs3-24\_ne0-0\_hcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_lcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_mcap\_ncmp\_maxrbw
 Irs1-0\_re1-24\_mcap\_ncmp\_maxrbw

Why computational storage?

LANL Mission ~= Weapons Science / \$

Lets grow the Weapons Science

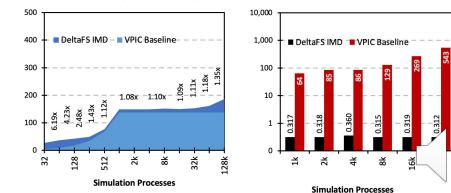


### **Near-device Indexing and Analytics**

- Non-obvious requirements
  - Simulations run under intense memory pressure (app may use 90%)
  - In-situ indexing runs into scaling limitations
  - Users must only be able to see their data (strict security)
- Computational Storage Benefits/Opportunities
  - Speedups for post-hoc analysis (1000x speedup demonstrated)
  - Post-hoc index creation (speculative)
  - · Less reliance on massive compute tier as a large merge sort space

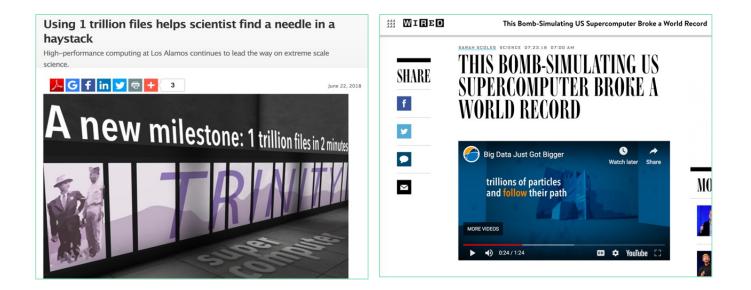
//O Time (sec)

Add a little time indexing on the way out and get 1000X on analysis step (the indexing must scale and be efficient (perfect offload opportunity)



Leverage IOPS we get with our needed Capacity and BW

> Single pass scan vs a single dimension index, our desire is more like 3-5 dimensions of index making the taking 100-1000x to 10,000X

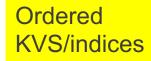


## Only Possible Because of Key-Value Storage!



#### **Analytics Application User Space Software Layers**

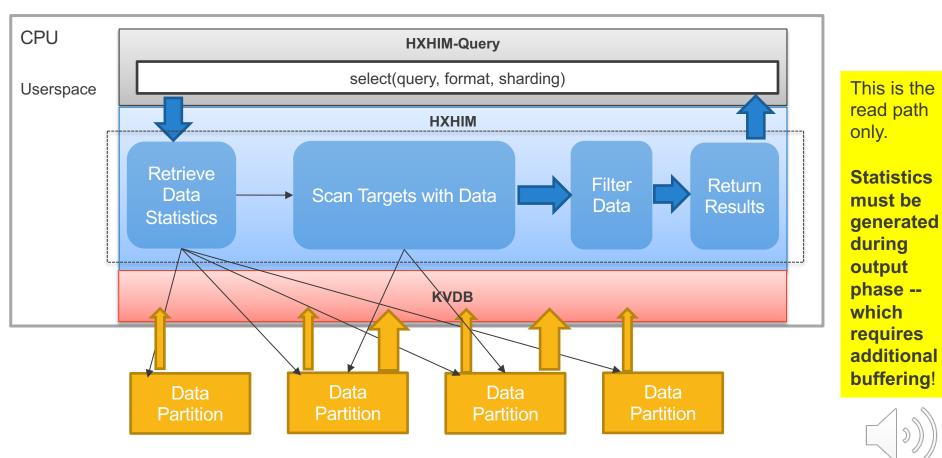
- 2 example scientific queries:
  - Find the N highest energy particles
    - Ex: Select 10,000 48B particles from 1 Trillion particles
  - Return ranges of 10 or more contiguous mesh cells that contain more than N% of material X
    - Ex: Results in 1-0 1000 cell (1KB cells) ranges from 3 Trillion cells
- Query tool leverages statistics to improve performance
  - Histogram to describe energy distribution
  - · Min and max material for an array
- Both queries can also leverage data organization for acceleration
  - Sort by energy
  - Sort by cell position



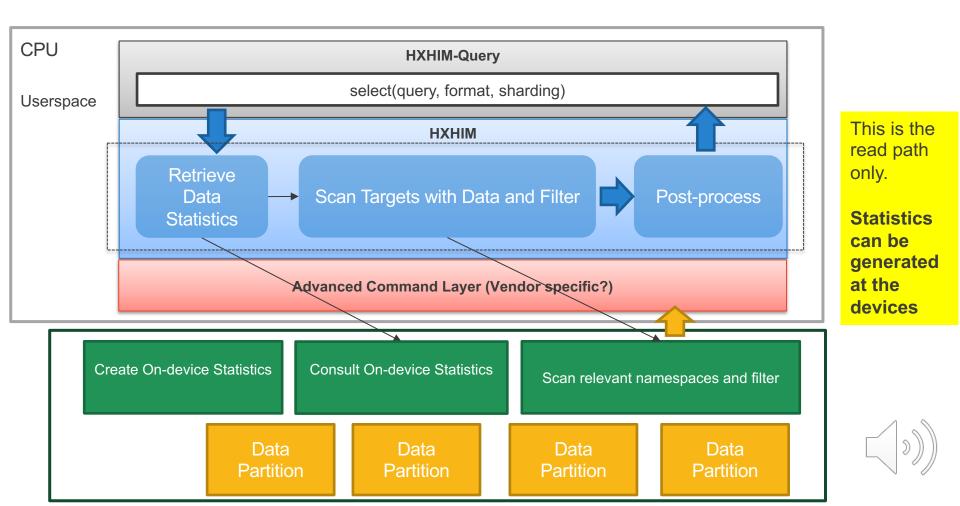
Histograms



# User-space Analytics Application Software Layers using HXHIM (distributed parallel KVS framework)

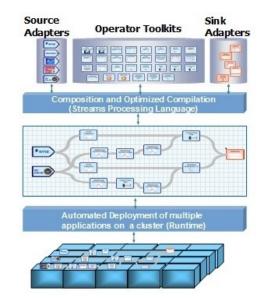


#### **Offloaded Analytics Application Software Layers**



# How do you think about using computational storage/offloading functions/programming?

- Middleware: Hxhim (distributed parallel KVS framework) Emerging standards? NVME Computational Storage TP4091 Runtime/Common Api's: Legion, OpenSNAPI Different storage paradigm than block? Ordered KVS Learn lessons from streams programming paradigm?
  - System S (DOD/IBM)
  - Netsketch (CMU)





Join us in seeking backwards to efficient mission



