Kokkos Tools:

Kokkos support in the TAU and APEX portable performance measurement tools

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http://www.nic.uoregon.edu/~khuck/kokkos/KUG2023



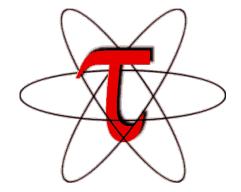
TAU Performance System



TAU Performance System

- <u>T</u>uning and <u>A</u>nalysis <u>U</u>tilities (29+ year project)
- Integrated performance toolkit:
 - Multi-level performance instrumentation
 - Highly configurable
 - Widely ported performance profiling / tracing system
 - Portable (java, python) visualization / exploration / analysis tools
- Supports all major HPC programming models
- MPI/SHMEM, OpenMP, OpenACC, CUDA, HIP, SYCL/OneAPI, <u>Kokkos</u>...
- Support for ML/AI frameworks: TensorFlow, pyTorch, Horovod
- Integrated with PAPI, LIKWID for hardware counter support
- <u>https://tau.uoregon.edu</u> or <u>https://github.com/UO-OACISS/tau2</u> (public mirror)





Performance Measurement

Timers

- Requires instrumentation of some kind
 - Manual, automated
 - Source, compiler provided, binary
 - Library callbacks, API wrappers, weak symbol replacement
- Simple to implement

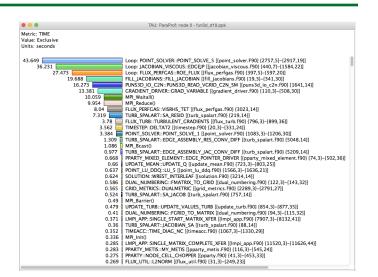
Sampling

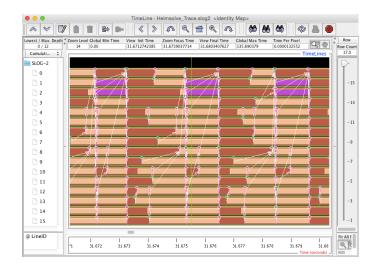
- Requires specialized system libraries / support
 - Periodic signals, signal handler
 - Call stack unwinding
- No modification to executable/library needed
- Potential to interfere with system support (signal handlers)
- Can mix with timers to generate a hybrid profile



Profiling and Tracing

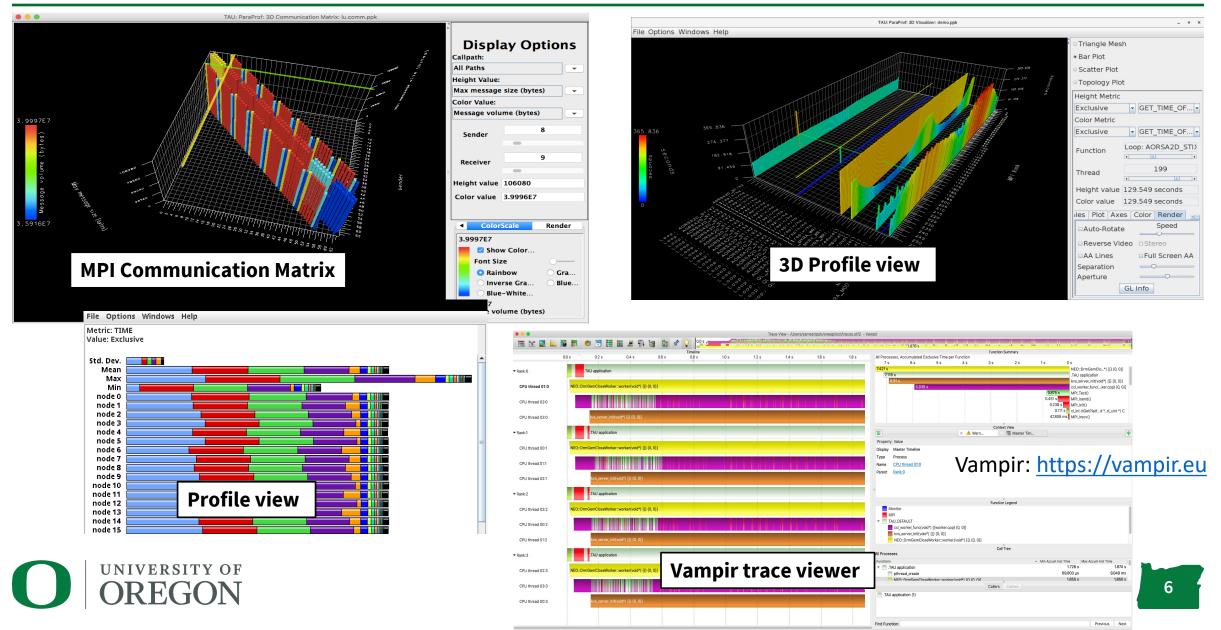
- Profiling: how much time was spent in each measured function on each thread in each process?
 - Collapses the time axis
 - No ordering or causal event information
 - Small summary per thread/process, regardless of execution time – only grows with number of timers & threads/processes
- **Tracing**: record all function entry & exit events on a timeline
 - Detailed view of what happened
 - The longer the program runs, the bigger the trace







TAU Analysis Tools: ParaProf, Vampir



Kokkos support in TAU – since February, 2017

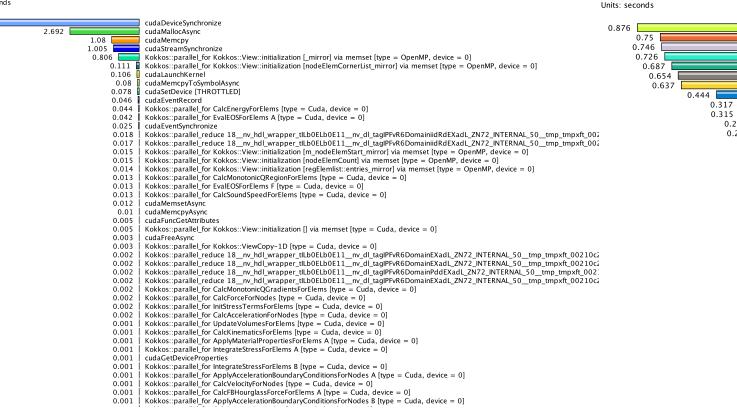
- TAU implements the Kokkos Profiling API (Kokkos_Profiling_C_Interface.h)
- TAU sets an environment variable KOKKOS_PROFILE_LIBRARY to tell Kokkos that it should enable profiling and enable function callbacks to the TAU implementations
- TAU implements
 - kokkosp_[init|finalize]_library
 - kokkosp_[begin|end]_parallel_[for|scan|reduce]
 - kokkosp_[push|pop]_profile_region
- Names for regions are passed to the tools to provide intelligent labels
- In addition, TAU also implements support for native Pthreads, OpenMP, OpenACC, CUDA, HIP, SYCL back-end measurement – no code changes necessary
- Fun fact: if you have a Raja application, and Raja is configured with -DRAJA_ENABLE_RUNTIME_PLUGINS, Raja implements the same callback API!



TAU Example – Kokkos Lulesh (from kokkos-miniapps)

Metric: TAUGPU_TIME Value: Exclusive Units: seconds

5.537



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Memory copy Host to Device

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Main thread launching kernels

Virtual thread with CUDA activity



Intel Xeon system with NVIDIA A100, size 256, 100 iterations, one rank

Metric: TAUGPU TIME

Value: Exclusive

PerfStubs side note...

- PerfStubs is a "frictionless" instrumentation library
 - <u>https://github.com/UO-OACISS/perfstubs</u>
 - One source file, three headers
 - Provides a plugin interface for performance tools
 - Can be compiled away if desired
- Integrated into several libraries (so far) as a git submodule
 - CAMTIMERS
 - PETSc
 - Ginkgo
 - ADIOS2
 - Others?

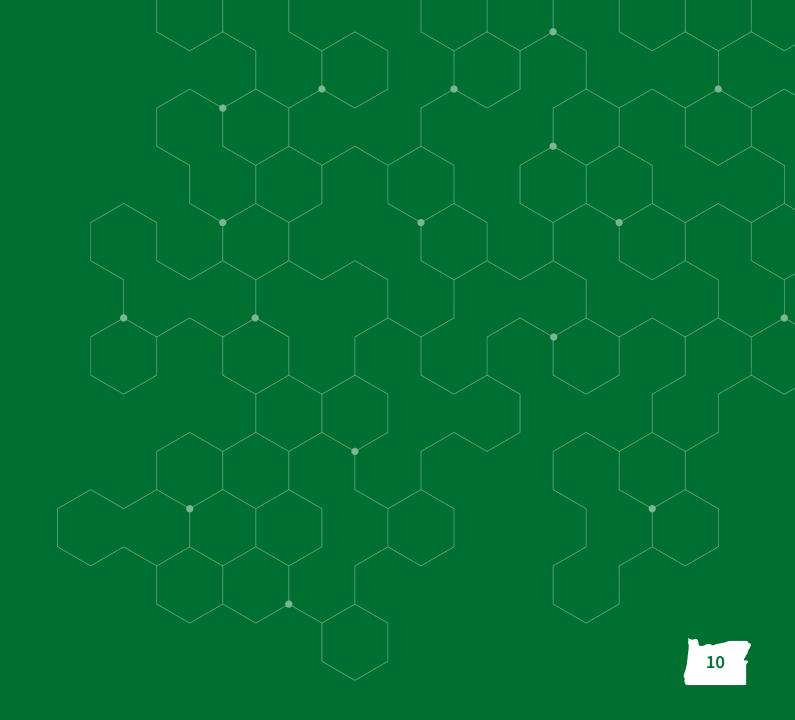
Boehme, Huck, Madsen, Weidendorfer, "The Case for a Common Instrumentation Interface for HPC Codes" <u>https://doi.org/10.1109/ProTools49597.2019.00010</u>, 2019

Provides runtime integration with TAU & APEX





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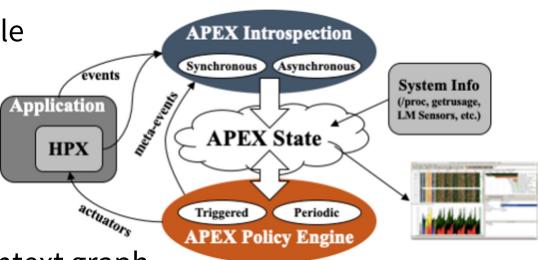


Autonomic Performance Environment for Exascale (APEX)

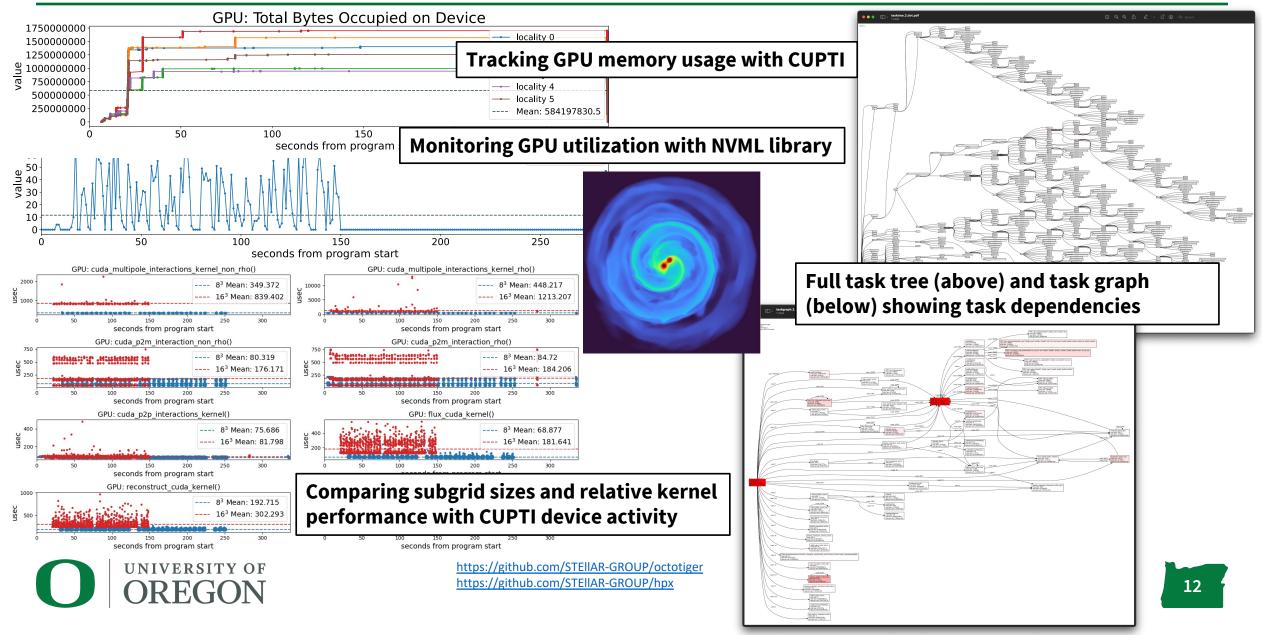
- ascale (APEX) 🛛 🗸
- Autonomic Performance Environment for eXascale
- Performance Measurement
- Runtime Adaptation
- Designed for AMT runtimes (HPX)
 - but works with conventional parallel models
- Focus on task dependency graph, not calling context graph
- Supports HPX, C/C++ threads, OpenMP, OpenACC, Kokkos, Raja, CUDA, HIP, SYCL, StarPU... Working on YAKL, Iris
- <u>https://github.com/UO-OACISS/apex and https://github.com/khuck/apex-tutorial</u>
- Active Harmony* (Nelder Mead), Simulated Annealing, hill climbing for parametric search methods



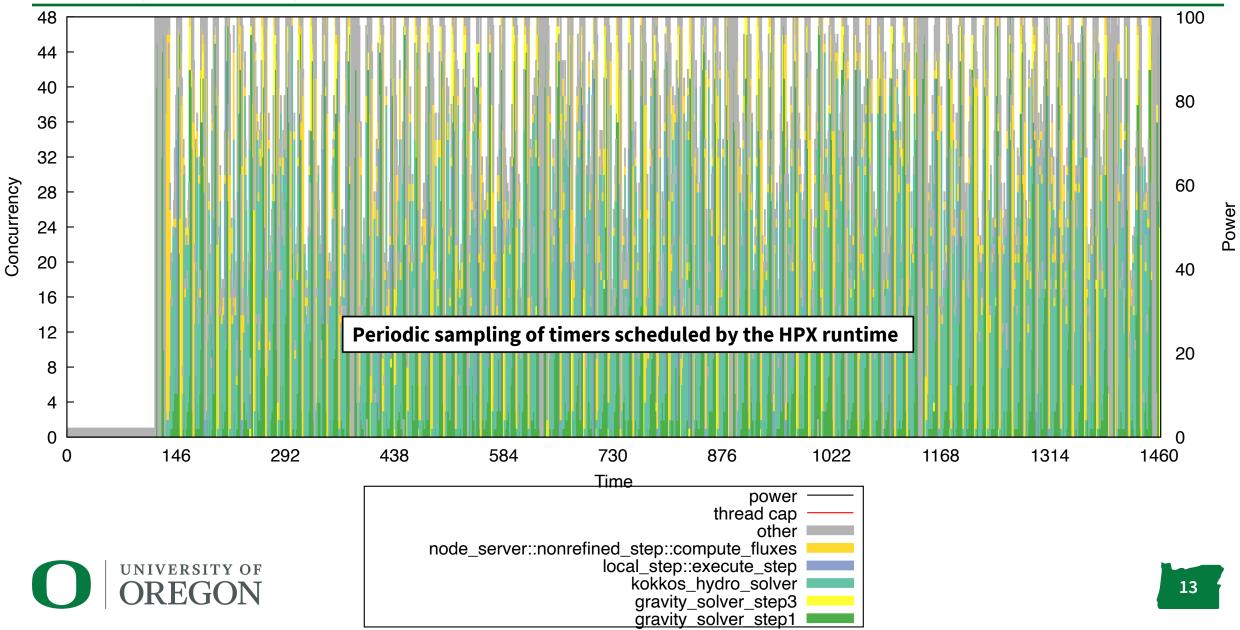
https://doi.org/10.1109/ESPM256814.2022.00008 : "Broad Performance Measurement Support for Asynchronous Multi-Tasking with APEX", Huck, ESPM, 2022



APEX example – Octo-Tiger (Octree astrophysics in HPX, Kokkos)

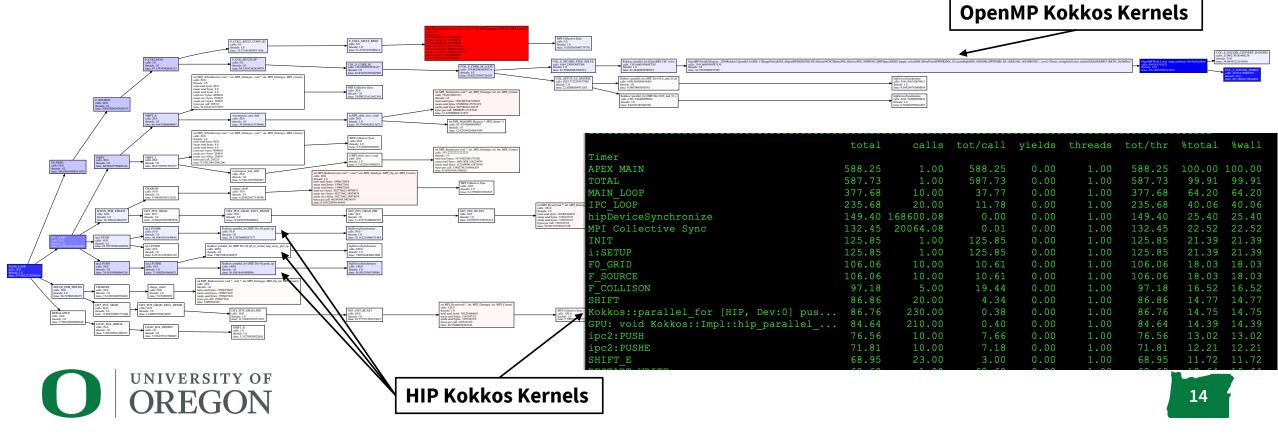


Octotiger on Fugaku – recent result

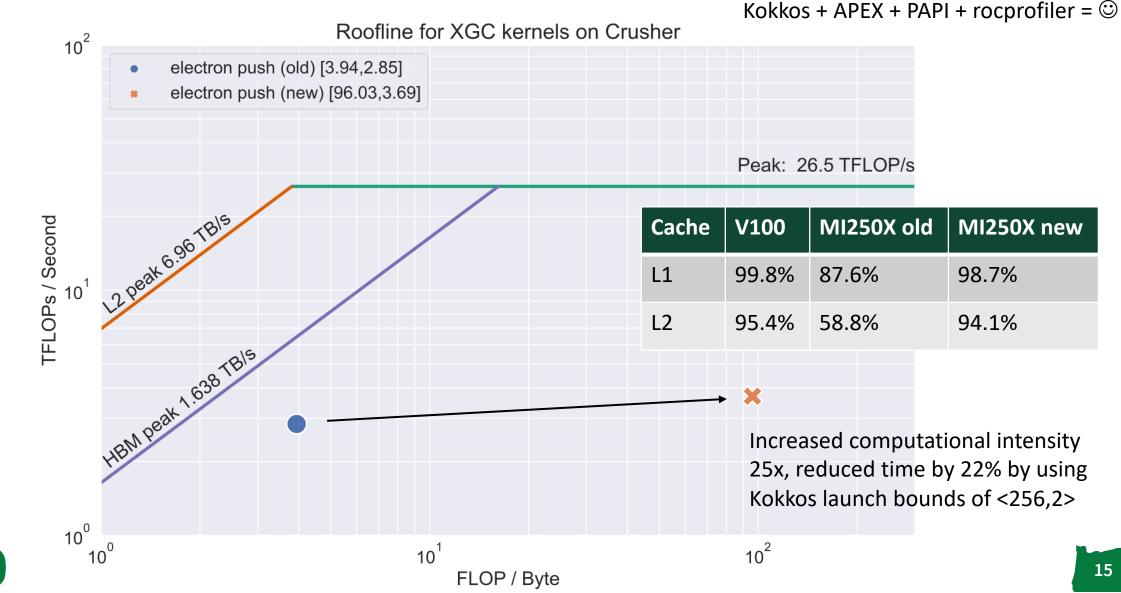


Example: XGC (tokamak plasma fusion PIC) on Frontier, 512 ranks

- Uses support for MPI, OpenMP-Tools, PerfStubs, Kokkos, Hip
- Post-processing view of MAIN_LOOP subtree, only with accumulated times > 5.0 seconds (only 72 nodes of 6298 of full tree)
- Red: MPI, blue: other, intensity = % of total subtree



XGC: Push Kernel on Crusher/Frontier, Kokkos helped generate roofline



15

Kokkos Lulesh and APEX Tracing – OpenMP, CUDA, HIP back ends

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Kokkos Support in APEX

- APEX implements the same profiling API that TAU does, and...
- APEX provides autotuning (search) support
- Kokkos provides the ability to autotune with:

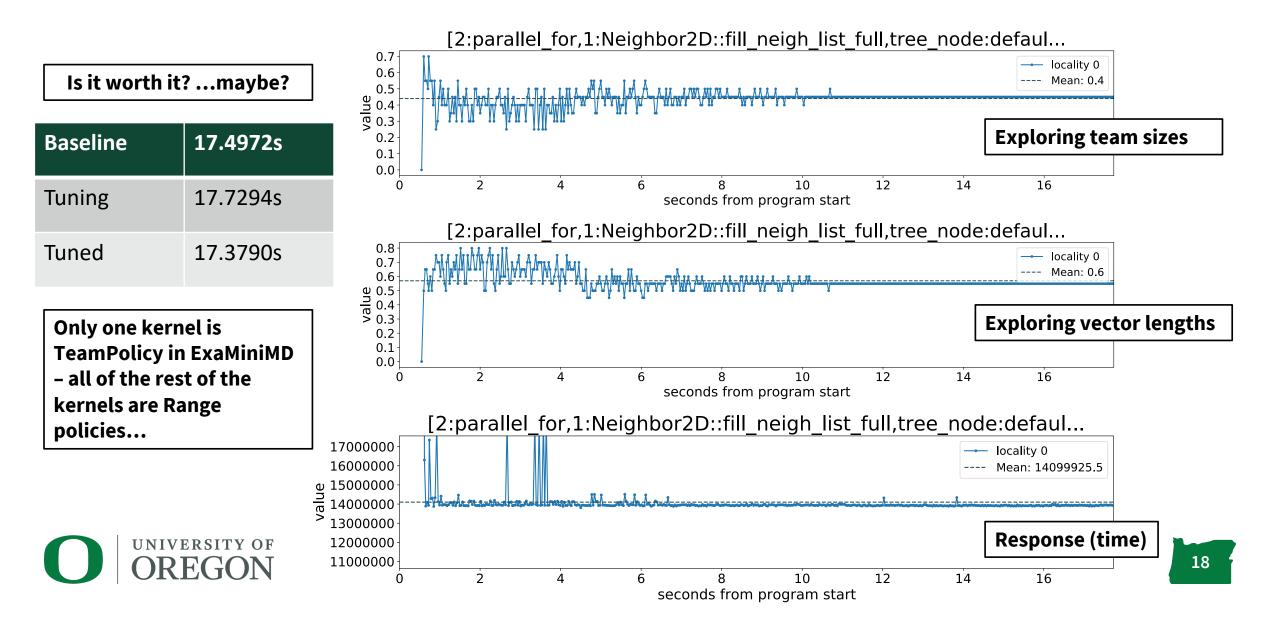
-DKokkos_ENABLE_TUNING=ON

- Automatically provides input and context variables for parallel_for, parallel_reduce, parallel_scan, parallel_copy.
 - TeamPolicy: team size and vector length
 - MDRangePolicy: tile sizes
 - RangePolicy^{*}: block size

^{*}(in a long-dormant development fork/branch...would be nice to have because many kernels use RangePolicy)



APEX Autotuning of ExaMiniMD Neighbor2D::fill_neigh_list_full kernel



TAU or APEX?

- Use TAU when:
 - Advanced MPI or SHMEM measurements
 - Sampling support
 - HW/OS context (per-OS thread measurements)
 - Broader HW support
 - Python/ML/AI support
 - TAU plugin support
- Use APEX when:
 - Support for asynchronous tasking
 - Focus on algorithmic task dependency, not HW/OS
 - Runtime autotuning / feedback & control support



Kokkos Wishlist

- Autotuning:
 - Support for Range policy
 - Access to non-normalized input variables (all are mapped to [0.0 ... 1.0])
 - I think I know why this was done, but it's confusing/misleading without a map
- Default labels with source info ③
 - Or at least a function pointer



Acknowledgements

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Thanks! Questions?

