

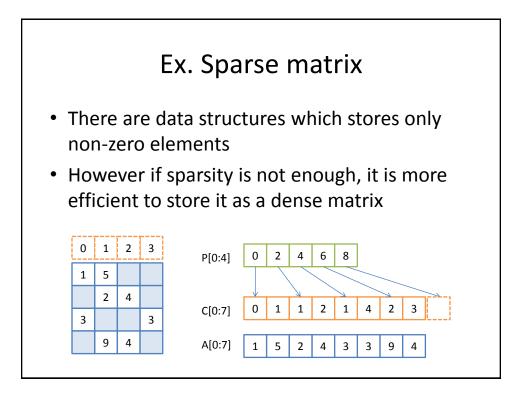
- There are deterministic improvements and nondeterministic tunings
- We want to try nondeterministic tunings to find whether they are effective or not

No optimal solution in HPC

- Performance depends on conditions
 - HW conditions
 - Cache size, #cores, memory latency, network speed...
 - SW conditions
 - Library performance, working memory size...
 - Data conditions
 - Size of matrix, values, graph structures...
 - Environmental conditions
 - Other users, other processes...
- Tuning must be empirical

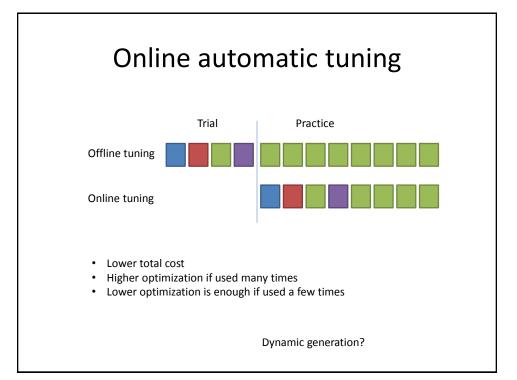
Ex. BLAS

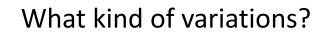
- BLAS provides a high-performance implementation of basic linear algebra routines
- Can be 100x faster than naïve code
 But usually tuned for very large matrices
- Could be 100x slower than naïve code for very small matrices (e.g. 3x3 or 4x4)



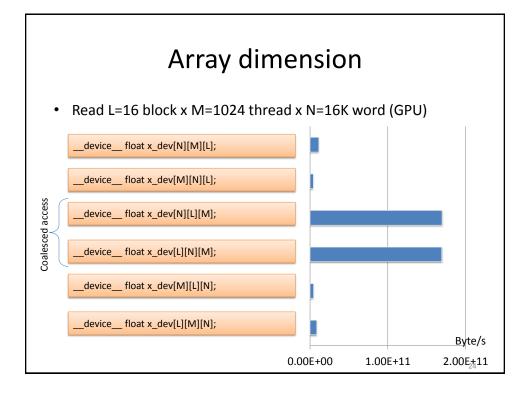
Automatic tuning

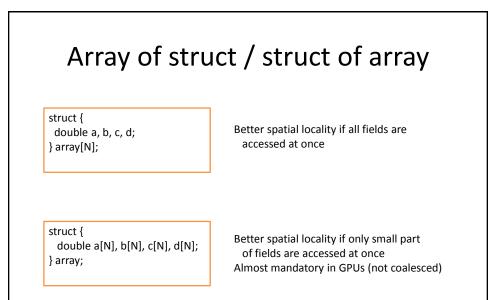
- Several variations of the same computation are programmed
- Performance is automatically measured, and a well performing one is automatically selected
- Problems
 - How to generate variations?
 - How to select a good variation?

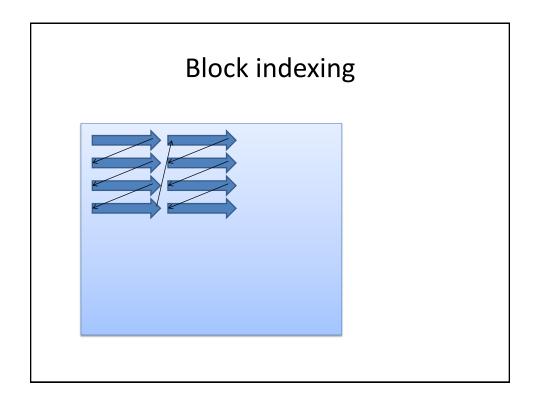




- Scheduling variations
 - unrolling, code motion, loop transformation, software pipelining
 - scheduling in parallel processing
- Data structure variations
 - array dimension, padding, skewing, space-filling order, (recursive) block indexing, reordering
 - list vs array, array-of-struct vs struct-of-array, object inlining
 - distributed data structure, software cache
- Algorithmic variations
 - different algorithm, preprocessing, parallelization, mixed precision
- Platform specific coding
 - message passing, short vector instructions, GPU etc.
- Data structure vs code generation, storage vs recomputation







Parallel processing

- Moore's law continues, but...
 - The clock frequency will not improve much (because of power & cooling limitation)
 - Performance only comes from parallelism
- Free lunch is over
- In 10 years, processors have 20 ~ 200 cores
 - Everyone needs to do parallel programming

