### Sparse solvers & preconditioners Sherry Li, LBNL

- SuperLU direct solver used in M3D-C1 and NIMROD
   for many years. In 3D, used as Block-Jacobi preconditioner.
- STRUMPACK also based on factorization, but more flexible
  - Direct solver without approximation
  - "Inexact" direct solver with small low-rank compression
    - One factorization, one triangular solve.
    - May ask for a few steps of iterative refinement to get higher accuracy.
  - Preconditioner with large compression
    - Can use PETSc's GMRES (or any iterative solver), specify STRUMPACK as preconditioner.
- May be worthwhile trying STRUMPACK preconditioner for the entire 3D problem, not just block diagonals.



# SuperLU factorization optimization on Cori KNL



Work with Sam Williams, Jack Deslippe, Steve Leak, Thanh Phung (Intel) (New release SuperLU\_DIST version 5.2.0)

- Overall, factorization is up to 80% speedup on single node.
  - Jin Chen's experiments at Intel Dungeon: M3D-C1 10% speedup.
  - Total time in SuperLU 50-80% : LU 43%, Triangular solve 57%
- Replace small independent single-threaded MKL GEMMs by large multithreaded MKL GEMMs: **15-20% faster.**
- Use new OpenMP features: **10-15% faster.** 
  - "task parallel" to reduce load imbalance
  - "nested parallel for" to increase parallelism
- Vectorizing Gather/Scatter: 10-20% faster.

```
    Hardware support: Load Vector Indexed / Store Vector Indexed
#pragma omp simd // vectorized Scatter
for (i = 0; i < b; ++i) {
        nzval[ indirect2[i] ] = nzval[ indirect[i] ] - tempv[i];
      }
```

• Several techniques to reduce cache misses.

## Future work – next 0.5 year



### SuperLU:

#### 1. Improve triangular solve.

As preconditioner, factorization needs only once, but each iterative step needs a triangular solve. Several techniques will be explored: asynchronous tree broadcast, selective inversion.

- 2. Improve factorization with 3D algorithm: replicate data structure, while reducing communication.
- 3. Suggestion for M3D-C1 configuration: use more than one 2D plane as diagonal block.

### **STRUMPACK:**

• More detailed performance profiling to identify bottlenecks, understand various solver/preconditioner configurations.

#### **Optimization: with Sam and postdoc**

• Autotuning of the solvers parameter space.

# "Inexact" direct solver – STRUMPACK



- Algebraic generalization to FMM, independent of Green's function.
  - Apply low-rank compression to off-diagonal blocks ("far-field interaction"), use hierarchical matrix algebra to reduce asymptotic complexity.
- Provides flexibility with inexact factorization via tolerance-controlled compression (save FLOPS and memory)





OpenMP task parallelism, 12-core Intel Ivy Bridge



#### Status:

- 5x faster than dense LU (ACM TOMS 2016)
- 7x faster than traditional sparse MF solver (SIAM SISC 2016)

#### Future tasks:

- 1. Strumpack already in PETSc, will incorporate in Trillinos soon.
- 2. Tested Jin's recent matrices, found some inefficiency in the ordering phase, we fixed it.
- 3. Code is very new, less mature than SuperLU, will do lots of algorithm optimization, architecture-otiended code optimization ...