

# A Taste of Scientific Computing

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# What is Scientific Computing about?

You know the science; what more is there?

- Science often gives an implicit description.  
How do you turn it into something computational.
- Algorithms are not unique:  
There are many ways to solve a linear system

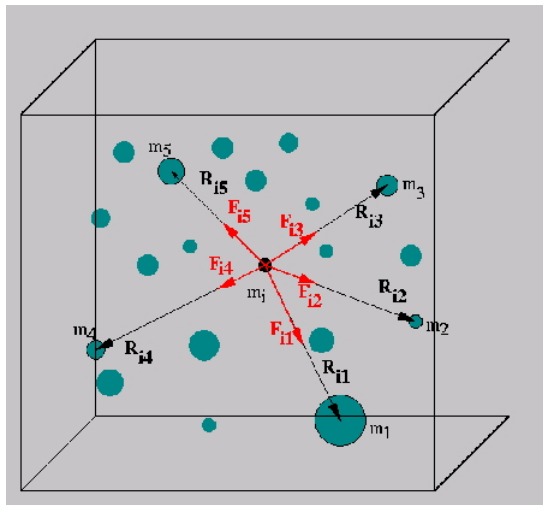
$$x: Ax = b$$

What are pros and cons of the choices?

- Algorithms can be implemented multiple ways, depending on your processor.

# Algorithmic choices

# Summing forces



# Particle interactions

for each particle  $i$

for each particle  $j$

let  $\vec{r}_{ij}$  be the vector between  $i$  and  $j$ ;

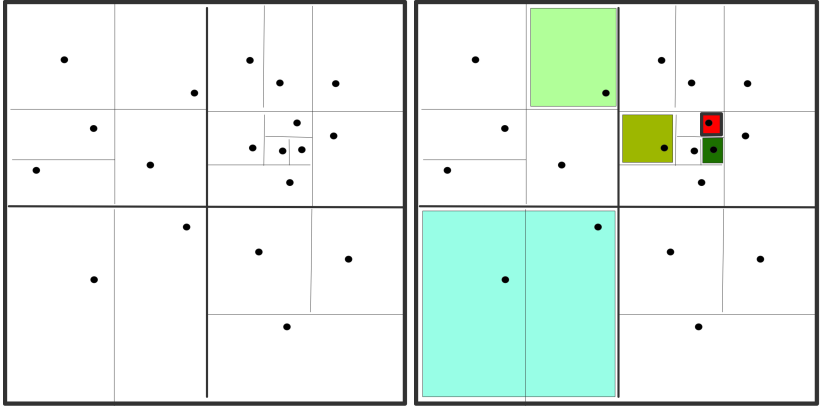
then the force on  $i$  because of  $j$  is

$$\vec{f}_{ij} = -\vec{r}_{ij} \frac{m_i m_j}{|\vec{r}_{ij}|^3}$$

(where  $m_i, m_j$  are the masses or charges) and

$$\vec{f}_{ji} = -\vec{f}_{ij}.$$

Naive all-pairs algorithm:  $O(N^2)$



Clever algorithms:  $O(N \log N)$ , sometimes even  $O(N)$

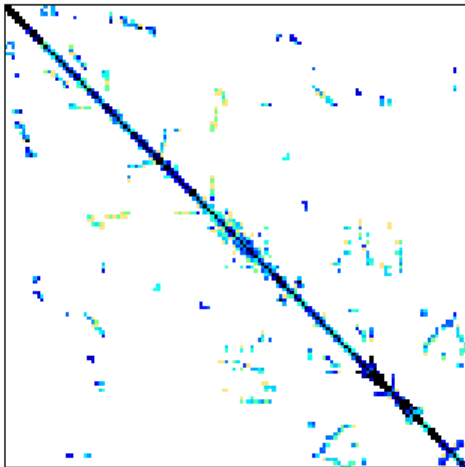
# Algorithm aspects

$$\underset{x}{?}: Ax = b$$

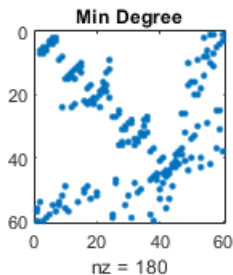
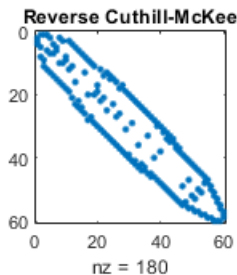
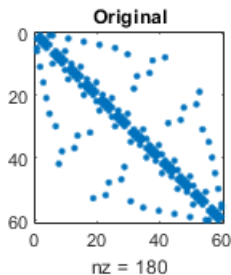
- Inversion:  $N^3$  operations, unstable
- Gaussian elimination:  $N^3$  but lower constant, stable
- Sparse Gaussian elimination:  $N^{3/2}$ , hard to program
- Iterative methods:  $N \cdot \kappa^{1/2}$ , not always successful
- Multigrid:  $O(N)$ , very limited applicability.



# Sparse matrices



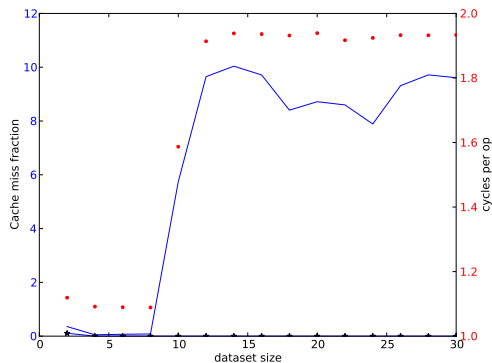
# Permuting the matrix



# **The influence of your architecture**

# Fitting data to cache

```
for (j=0; j<size; j++)  
    array[j] = 2.3*array[j]+1.2;
```

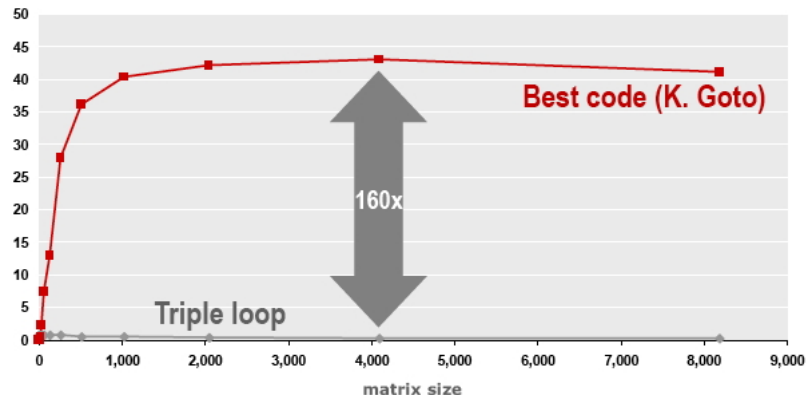


# Matrix-matrix product

Lots of small optimizations add up:

**Matrix-Matrix Multiplication (MMM) on 2 x Core 2 Duo 3 GHz (double precision)**

Gflop/s



# Computer arithmetic

Computer numbers are not real numbers. If you don't pay attention to this you may lose a rocket.



**So what is scientific computing about?**

# Between science and computing

- Modeling
- Numerical analysis
- Linear algebra
- Computer architecture
- ... and the interaction between any and all of these.