



Flop and Complexity

Linear Algebra

Department of Computer Engineering
Sharif University of Technology

Hamid R. Rabiee rabiee@sharif.edu

Maryam Ramezani maryam.ramezani@sharif.edu



- ❑ Computers store (real) numbers in floating-point format
- ❑ Floating point= 64 bits or 8 bytes
 - How many possible sequences of bits?
 - How many bytes to store n -vector?
- ❑ Current memory and storage devices, with capacities measured in many gigabytes (10^9 bytes), can easily store vectors with dimensions in the millions or billions.
- ❑ Sparse vectors are stored in a more efficient way that keeps track of indices and values of the nonzero entries.
- ❑ Note about floating point operations and round-off error.



FLOP (Floating Point Operations)

- ❑ The unit of complexity when comparing vector and matrix algorithms
- ❑ 1 flop = one basic arithmetic operation in \mathbb{R} or \mathbb{C} ($+$, $-$, $*$, $\sqrt{}$, \dots)
- ❑ Estimate the time of computation = counting the total number of Floating Point Operations (FLOP)s.

Notes:

- ❑ We don't distinguish between the different types of arithmetic operations.
- ❑ We don't distinguish between real and complex arithmetic.
- ❑ We ignore integer operations (indexing, loop counters, \dots)
- ❑ We ignore cost of memory access.



- ❑ Operation count (flop count)

- Total number of operations in an algorithm
- $runtime \approx \frac{\text{number of operations (flops)}}{\text{computer speed (flops per second)}}$

- ❑ Dominant term: the highest-order term in the flop count

$$\frac{1}{3}n^3 + 100n^2 + 10n + 5 \approx \frac{1}{3}n^3$$

- ❑ Order: the power in the dominant term:

$$\frac{1}{3}n^3 + 10n^2 + 100 = \text{order } n^3$$



- ❑ How quickly the vector operations can be carried out by a computer depends very much on the computer hardware and software, and the size of the vector.
- ❑ The **complexity of an operation** is the number of flops required to carry it out, as a function of the size or sizes of the input to the operation.
- ❑ **Crude approximation of time to execute:**
 $(\text{flops needed}) / (\text{computer speed})$
- ❑ current computers are around 1 Gflop/sec (10^9 flops/sec)



- ❑ Zero vector 0_n
- ❑ Ones vector 1_n
- ❑ Unit vector e_i (e_i is the entry with 1 value)
- ❑ Sparse vector: a vector if many of its entries are zero
 - Can be stored and manipulated efficiently on a computer
 - **nnz(x)**: number of entries of vector x that are nonzero

Example

- ❑ Write all unit vectors with length of 3.
- ❑ What is the most sparsest vector?



Operation	#FLOPS		Complexity	
	General	Sparse	General	Sparse
Scalar-Vector product				
Vector-Vector sum				
Inner product				
Outer product (vectors with sizes “n” and “m”)				
Hadamard product				



- ❑ Introduction to Applied Linear Algebra Vectors, Matrices, and Least Squares
- ❑ Linear Algebra and its applications
- ❑ Linear algebra A Modern Introduction David Poole
- ❑ Floating Point Operations in Matrix–Vector Calculus, Raphael Hunger