# 5. Complexity of matrix algorithms

- flop counts
- vector-vector operations
- matrix-vector product
- matrix-matrix product

# **Flop counts**

#### floating-point operation (flop)

- one floating-point addition, subtraction, multiplication, or division
- other common definition: one multiplication followed by one addition

#### flop counts of matrix algorithm

- total number of flops is typically a polynomial of the problem dimensions
- usually simplified by ignoring lower-order terms

#### applications

- a simple, machine-independent measure of algorithm complexity
- not an accurate predictor of computation time on modern computers

### **Vector-vector operations**

• inner product of two *n*-vectors

$$x^T y = x_1 y_1 + x_2 y_2 + \dots + x_n y_n$$

n multiplications and n-1 additions = 2n-1 flops (2n if  $n \gg 1$ )

• addition or subtraction of n-vectors: n flops

• scalar multiplication of *n*-vector : *n* flops

## Matrix-vector product

matrix-vector product with  $m \times n$ -matrix A:

y = Ax

m elements in y; each element requires an inner product of length n:

(2n-1)m flops

approximately 2mn for large n

#### special cases

- m = n, A diagonal: n flops
- m = n, A lower triangular: n(n+1) flops
- A very sparse (lots of zero coefficients): #flops  $\ll 2mn$

# Matrix-matrix product

product of  $m \times n$ -matrix A and  $n \times p$ -matrix B:

$$C = AB$$

mp elements in C; each element requires an inner product of length n:

mp(2n-1) flops

approximately 2mnp for large n

#### **Exercises**

1. evaluate y = ABx two ways (A and B are  $n \times n$ , x is a vector)

• 
$$y = (AB)x$$
 (MATLAB: C = A\*B; y = C\*x;)

• y = A(Bx) (MATLAB: z = B\*x; y = A\*z;)

both methods give the same answer, but which method is faster?

2. evaluate 
$$y = (I + uv^T)x$$
 where  $u$ ,  $v$ ,  $x$  are  $n$ -vectors

•  $A = I + uv^T$  followed by y = Ax (MATLAB: y = (eye(n)+u\*v')\*x)

• 
$$w = (v^T x)u$$
 followed by  $y = x + w$  (MATLAB:  $y = x + (v'*x)*u$ )

# References

Lecture notes on

Complexity of matrix algorithms, EE103, L. Vandenberhge, UCLA