Floating Point sign bil 12p. significant "mand-ssa" flust: 8 exp, 23 sig double: 11 exp, 52 sig 4.(210) = 4.1024 = 4.10 2 2 2 10 x

$$1 > \frac{3}{32}$$

$$1.0001 \cdot 10^{3}$$

$$1.000 \cdot 10^{3}$$

$$9 \cdot 10^{3}$$

$$52.9 = 43$$

0,0000000000000 acarete (15. 243 [000,1 =

Signit. Lype sign exp schrormal malters 0 .-- 0 +/-000 0 --- v i'ndinity 000 111111 1/-NaN 70 111111 0 = N.N = 0.00

x, yz 106 . a.bc-10 (x.y2.a.be).1064 (true ariur - x.yz.a.be)

Outline

Modeling the World with Arrays The World in a Vector What can Matrices Do? Graphs Sparsity Low-Rank Approximation Finding the Best: Optimization

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Modeling the World with Arrays The World in a Vector What can Matrices Do? Graphs Sparsity Low-Rank Approximation

Some Perspective

- We have so far (mostly) looked at what we can do with single numbers (and functions that return single numbers).
- ▶ Things can get *much* more interesting once we allow not just one, but *many* numbers together.
- ▶ It is natural to view an *array of numbers* as one object with its own rules.
 - The simplest such set of rules is that of a vector.
- A 2D array of numbers can also be looked at as a matrix.
- ► So it's natural to use the tools of computational linear algebra.
- 'Vector' and 'matrix' are just representations that come to life in many (many!) applications. The purpose of this section is to explore some of those applications.

Vectors What's a vector? beaberpes C = L.a a+ h: h+9 sedica = deadb c=a@b

Vectors from a CS Perspective

What would the concept of a vector look like in a programming language (e.g. Java)?

```
interface vector
op ald Isealers
op mul
    vector vadd (vector a, vectors)
    vector vseele (sealer a, vertorti
```

Vectors in the 'Real World'

Demo: Images as Vectors **Demo:** Sound as Vectors **Demo:** Shapes as Vectors

Outline

Modeling the World with Arrays The World in a Vector What can Matrices Do? Graphs Sparsity Low-Rank Approximation

Matrices

What does a matrix do?

It represents a *linear function* between two vector spaces $f: U \to V$ in terms of bases u_1, \ldots, u_n of U and v_1, \ldots, v_m of V. Let

$$\boldsymbol{u} = \alpha_1 \boldsymbol{u}_1 + \dots + \alpha_n \boldsymbol{u}_n$$

and

$$\boldsymbol{v} = \beta_1 \boldsymbol{v}_1 + \dots + \beta_m \boldsymbol{v}_m.$$



Then f can always be represented as a matrix that obtains the β s from the α s:

$$\begin{pmatrix} a_{11} & \cdots & a_{1n} \\ \vdots & \ddots & \vdots \\ a_{m1} & \cdots & a_{mn} \end{pmatrix} \begin{pmatrix} \alpha_1 \\ \vdots \\ \alpha_n \end{pmatrix} = \begin{pmatrix} \beta_1 \\ \vdots \\ \beta_m \end{pmatrix}.$$

Example: The 'Frequency Shift' Matrix

Assume both u and \mathbf{v} are linear combination of sounds of different frequencies:

$$\boldsymbol{u} = \alpha_1 \boldsymbol{u}_{110~\text{Hz}} + \alpha_2 \boldsymbol{u}_{220~\text{Hz}} + \dots + \alpha_4 \boldsymbol{u}_{880~\text{Hz}}$$

(analogously for v, but with β s). What matrix realizes a 'frequency doubling' of a signal represented this way?

$$\begin{bmatrix} 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \alpha_3 \\ \alpha_4 \end{bmatrix} = \begin{bmatrix} 0 \\ \alpha_1 \\ \alpha_2 \\ \alpha_3 \end{bmatrix}$$

Example: The 'Frequency Shift' Matrix

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(analogously for v, but with β s). What matrix realizes a 'frequency doubling' of a signal represented this way?

