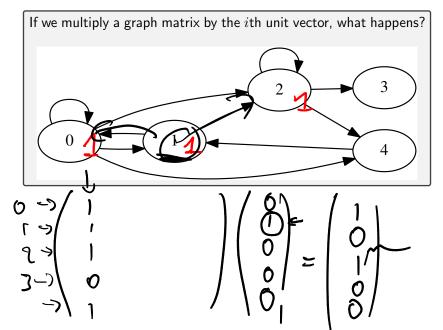
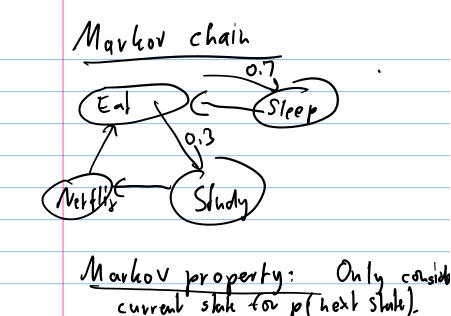
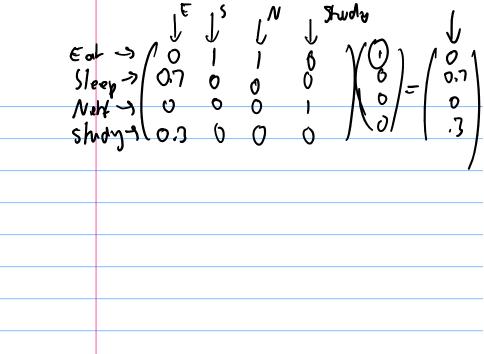
Overview Graphs as maked HWS all Sparse makeles Example 3 dales Norms

$$\begin{cases} o_{1} \mid \beta^{h} \leq \begin{bmatrix} -1, 1 \end{bmatrix}^{h} \\ \begin{pmatrix} o \\ i \\ 0 \end{pmatrix} & \begin{pmatrix} -0.3 \\ 0.5 \\ i \\ 0.3 \end{pmatrix} \end{cases}$$

## Graph Matrices and Matrix-Vector Multiplication







Demo: Matrices for Graph Traversal

### Outline

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

### Storing Sparse Matrices

Some types of matrices (including graph matrices) contain many zeros.

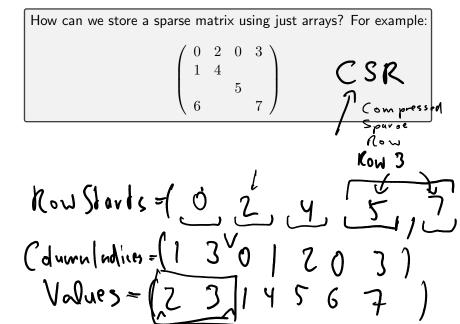
Storing all those zero entries is wasteful.

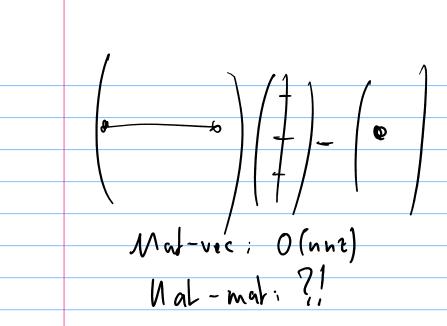
How can we store them so that we avoid storing tons of zeros?

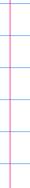
$$\begin{pmatrix}
0 & 3 \\
7 & 0
\end{pmatrix}$$

$$\{0: \{1: 33, 1: \{0:7\}\}\}$$

# Storing Sparse Matrices Using Arrays











Row Starts= (0, 2,2,3 (olldx = (0) 10)





Demo: Sparse Matrices in CSR Format

### Outline

Low-Rank Approximation Norms and Errors

#### **Norms**

What's a norm?

Define norm.