

Intro to CS16

CS16: Introduction to Algorithms & Data Structures
Summer 2021

Welcome to CS16!

Join Prismia at <https://bit.ly/3tEjxTB>

Feel free to turn your camera on (but you don't have to)

Eid Mubarak!



Doug Woos

he/him/his

Call me Doug, Professor Woos, etc.

Meet the TAs!

- ▶ They are great

Data structures Algorithms



A problem

- ▶ We have a collection of **tasks** we want to accomplish
 - ▶ Each task has a **priority** (1, 2, etc.)
 - ▶ Multiple tasks can have the same priority
 - ▶ Tasks with lower priority numbers need to be done first
- ▶ In what **order** should I do these tasks?
- ▶ Example: email inbox
 - ▶ Question from a colleague about a paper (priority 2)
 - ▶ Urgent message from TAs about class (priority 1)
 - ▶ Good deal on a used banjo (priority 3)

Data structures

how should our data be organized?

Algorithms

how should we use our organized data to solve the problem?

A problem

- ▶ We have a collection of **tasks** we want to accomplish
 - ▶ Some tasks depend on other tasks
 - ▶ Some are independent
- ▶ In what **order** should I do these tasks?
- ▶ Example: I make really good burritos
 - ▶ Need to chop an onion before sautéing it
 - ▶ But, can sauté onion and cook rice simultaneously
 - ▶ BAD: sauté onions, chop onions, cook rice
 - ▶ GOOD: chop onions, cook rice, sauté onions



Data structures

how should our data be organized?

Algorithms

how should we use our organized data to solve the problem?



Another example: PageRank

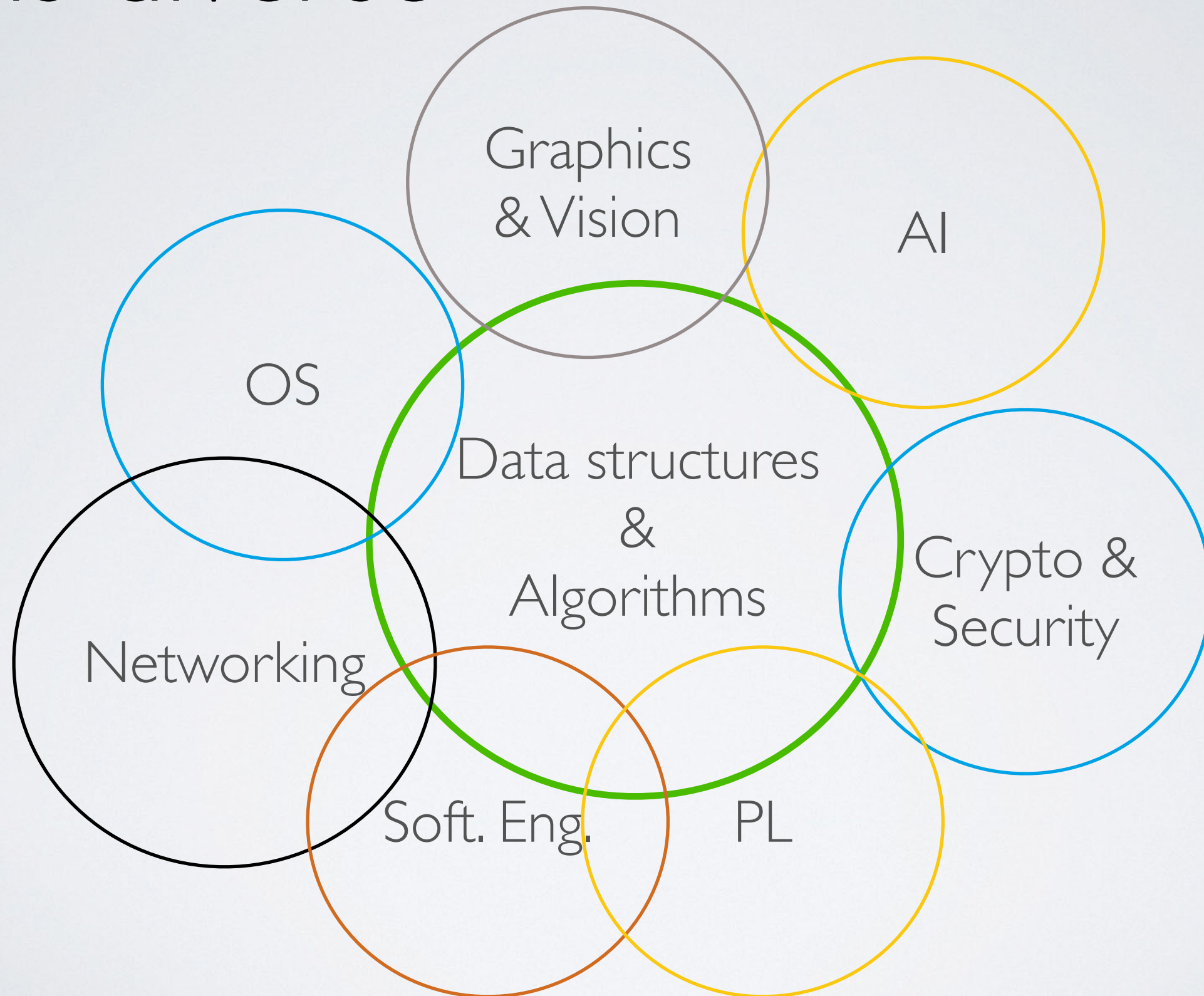
- ▶ Before 1999
 - ▶ search engines ranked pages using keyword frequency
 - ▶ well-known and worked OK
- ▶ Larry Page & Sergey Brin (PhD students @ Stanford)
 - ▶ noticed that links were important too!
 - ▶ links convey information about importance
 - ▶ But what exactly? and how can you make use of it?
 - ▶ This lead them to design PageRank

CS16 topics

- ▶ Implementing data structures and algorithms
- ▶ Analyzing data structures and algorithms
- ▶ Designing data structures and algorithms

Analysis: what makes an algorithm “good?”

CS is diverse



How CS16 works
(briefly)

Course Page

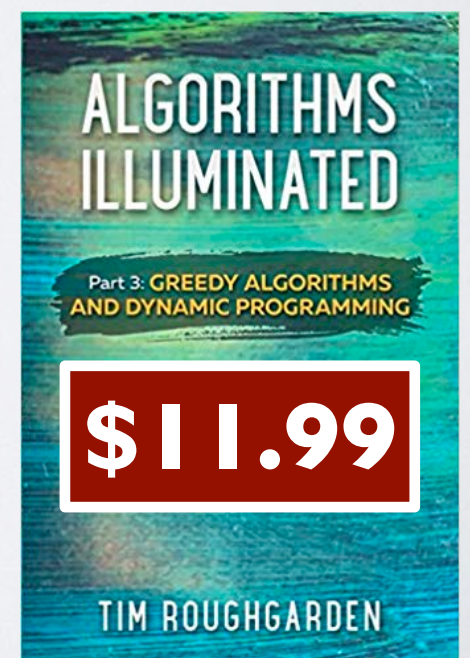
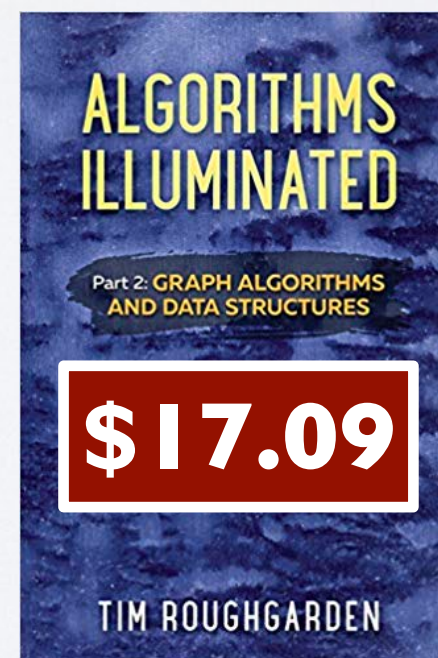
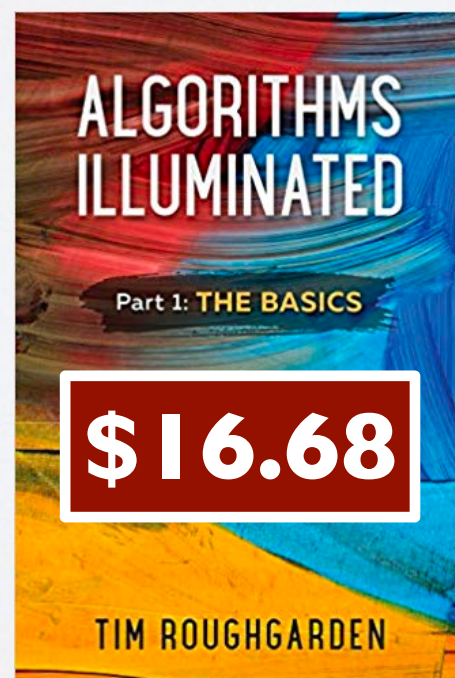
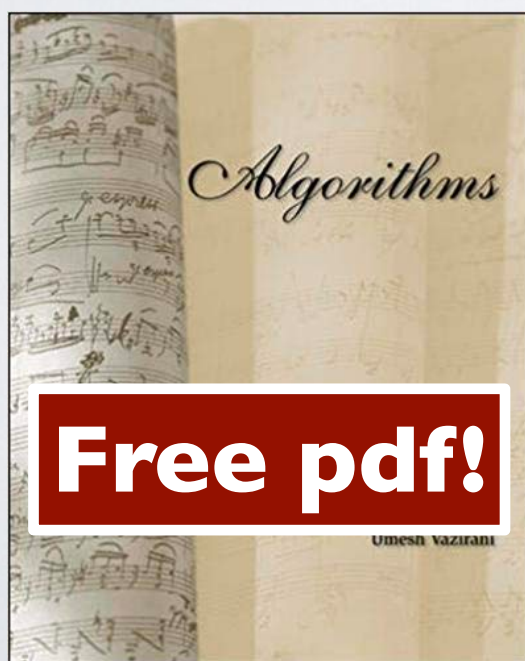
- ▶ Missive & Policies
- ▶ Slides
- ▶ Lecture capture
- ▶ Announcements
- ▶ Helpful Documents
 - ▶ Java, Latex & Python tips
 - ▶ Guides for testing, readmes, working from home, ...

Lectures

- ▶ Cover various algorithms & data structures
 - ▶ How they work
 - ▶ Why they work
 - ▶ Analysis
- ▶ Activities & discussions
- ▶ You are responsible for content in lecture (whether on slides or not)

Textbook

- ▶ No required textbook
- ▶ Helpful
 - ▶ Algorithms by Dasgupta, Papadimitriou and Vazirani
 - ▶ Algorithms Illuminated 1, 2 & 3 by Roughgarden



Ed

- ▶ Announcements
- ▶ Questions and answers
- ▶ Links to helpful material (blogs, Youtube videos)

Sections

- ▶ 1 hour/week with TAs
- ▶ 6–10 students
- ▶ Required!
- ▶ Mini assignments
- ▶ Mentor

Office Hours

- ▶ TA hours are very helpful
 - ▶ Try to get unstuck on your own first
 - ▶ TAs will ask you what you tried...
 - ▶ ... and send you back if you didn't try anything
- ▶ Doug's hours: Tuesdays 2:30-4:30 on Zoom
 - ▶ Open Zoom call
 - ▶ Come with conceptual questions, career questions, study/debugging skills questions, etc.
 - ▶ Also available by appointment
- ▶ Questions about HW or projects:
 - ▶ Post on Ed
 - ▶ Ask in Section
 - ▶ Hours

Assignments

- ▶ Homeworks
 - ▶ Due every(ish) week
 - ▶ Python code, proofs, analysis, ...
- ▶ Projects
 - ▶ 4 over the whole semester
 - ▶ Larger-scale Java programming
- ▶ Online midterm and final

Email Policy

- ▶ Unless matter is private always email HTAs!
 - ▶ Your email can get lost in Doug's inbox
 - ▶ It may take me a while to get to your email
 - ▶ HTAs may get to it faster & will remind me

Seam carving

our first algorithm!

Why seam carving?

- ▶ A cool algorithm with interesting applications
- ▶ Leads us into analysis of algorithms in general
 - ▶ We'll develop the tools we need over the next several lectures
 - ▶ For now, just try to understand what it's doing and why it works!



The New York Times



The New York Times



Image Resizing

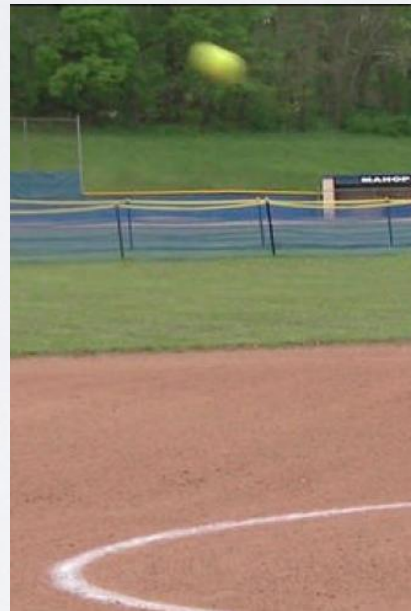


- ▶ Preserve important elements
- ▶ Remove/reduce repetitive areas

Image Resizing



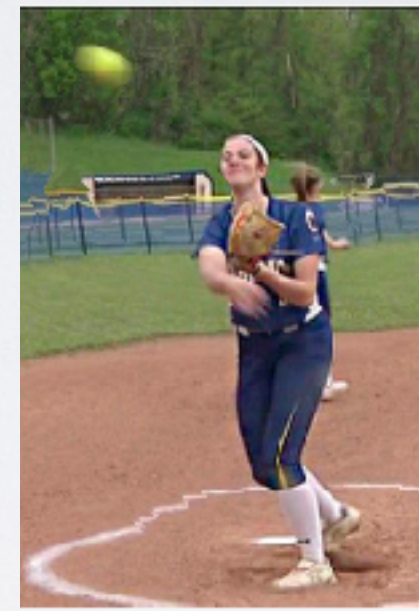
Fail



Fail



Fail



Success

Image Resizing

- ▶ To shrink image
 - ▶ remove unimportant pixels
- ▶ Quantify pixel *importance*
 - ▶ How much it varies from neighbors
 - ▶ Sum of differences with horizontal & vertical neighbors

Image Resizing

- ▶ Grayscale 3x3 image with the following pixel intensities
- ▶ Importance of the center pixel?

4	6	5
2	5	7
3	2	6

Image Resizing

- ▶ Quantify importance of every pixel
- ▶ Determine most and least important pixels



Low

High

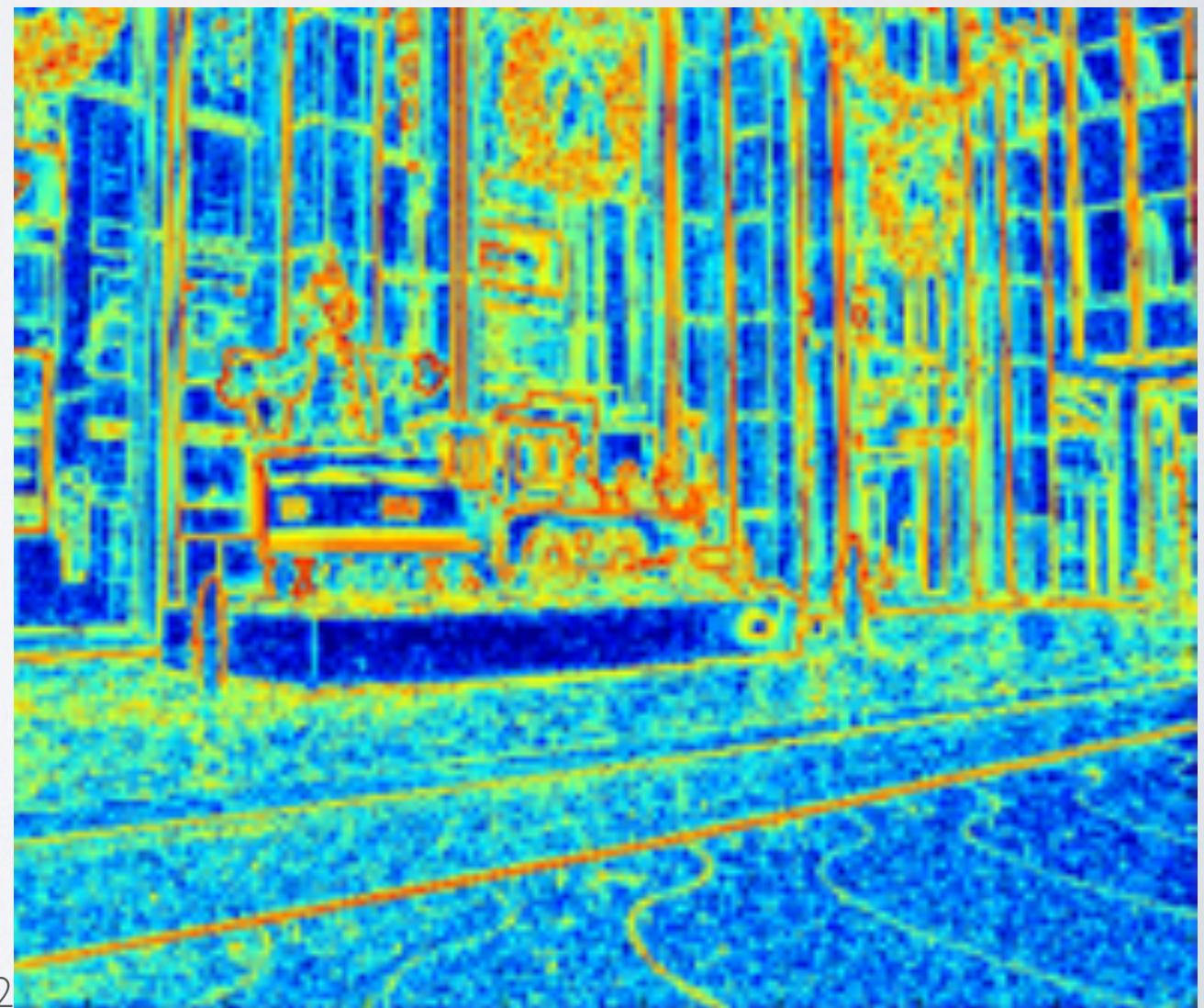


Image Resizing: Approach 1

- ▶ Remove all pixels with importance below some threshold
- ▶ Problem?
 - ▶ removing different # of pixels from each row
 - ▶ causes jagged right side

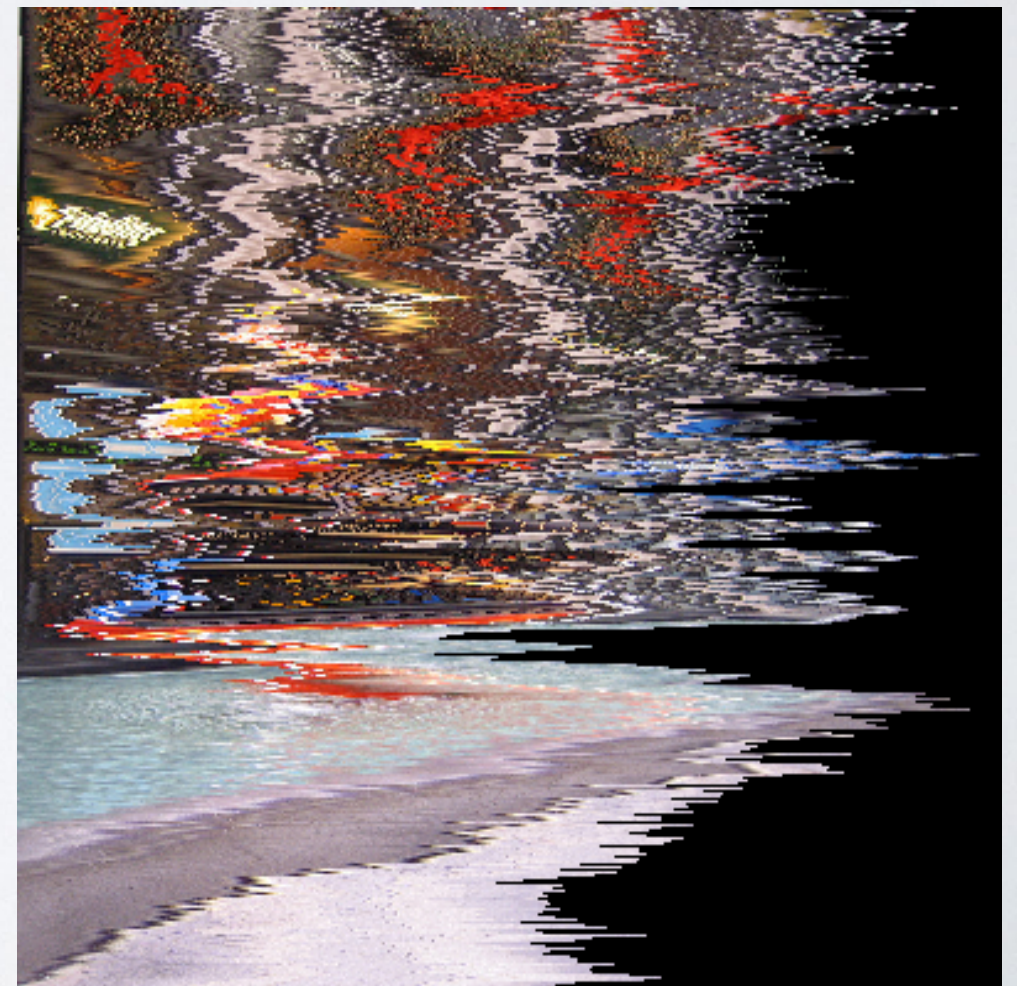


Image Resizing: Approach 2

- ▶ Remove n least important pixels in each row
- ▶ Still not great, too much shifting between adjacent rows



Image Resizing: Approach 3

- ▶ Remove column whose total importance is smallest, and repeat
- ▶ Much better! But not perfect...



Image Resizing

- ▶ Problem
 - ▶ removing entire column or entire row can distort image
- ▶ What pixels should we remove to resize this image?





YOU ARE
WELCOME
HERE

OSTEMA
BROWN

Seam carving



- ▶ **Idea:** remove **seams** not columns
 - ▶ (vertical) seam is a path from top to bottom
 - ▶ that moves left or right by at most one pixel per row

Seam carving



Near Perfection!

Object Removal via seam carving



- ▶ Mark object to remove as “unimportant”
 - ▶ artificially deflate the importance of its pixels
- ▶ Pixels will be removed by algorithm

Seam carving

- ▶ Input
 - ▶ 2D array of importance values
- ▶ Output
 - ▶ Vertical seam with lowest importance

7x3 Importance Array

9	3	8	15	1	11	7
6	13	9	5	10	4	14
9	6	7	9	14	7	11

7x3 Importance Array

9	3	8	15	1	11	7
6	13	9	5	10	4	14
9	6	7	9	14	7	11

10x10 Importance Array

1	2	6	9	12	6	5	12	5	6
2	3	11	14	10	6	15	9	9	1
2	9	13	4	1	7	10	4	12	11
6	5	15	12	11	4	7	15	8	5
14	15	11	12	4	14	3	10	1	10
6	12	13	8	15	6	13	3	13	11
2	1	14	6	14	4	13	14	7	4
14	8	4	11	14	6	12	10	2	7
6	8	12	13	2	11	6	6	8	7
11	2	15	9	8	12	10	8	6	9

10x10 Importance Array

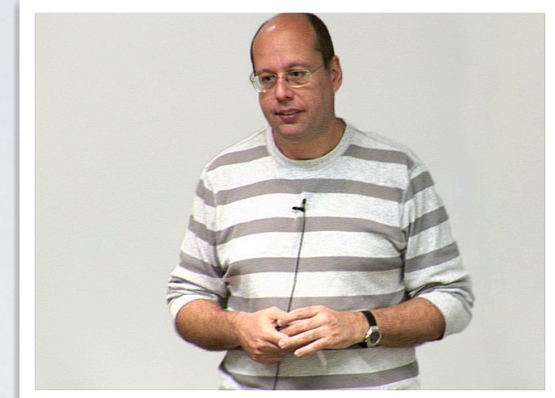
1	2	6	9	12	6	5	12	5	6
2	3	11	14	10	6	15	9	9	1
2	9	13	4	1	7	10	4	12	11
6	5	15	12	11	4	7	15	8	5
14	15	11	12	4	14	3	10	1	10
6	12	13	8	15	6	13	3	13	11
2	1	14	6	14	4	13	14	7	4
14	8	4	11	14	6	12	10	2	7
6	8	12	13	2	11	6	6	8	7
11	2	15	9	8	12	10	8	6	9

Seams

- ▶ Approximately $C \times 3^R$ seams in $C \times R$ image
- ▶ For 10×10
 - ▶ $\approx 590,490$ seams
- ▶ For 500×500
 - ▶ $\approx 1.81801... \times 10^{241}$ seams (242 digits)
- ▶ Age of the Universe
 - ▶ 4.3×10^{17} seconds

Seam carving

- ▶ Invented by
 - ▶ Shai Avidan (MERL)
 - ▶ Ariel Shamir (Interdisciplinary Center, Herzliya)
 - ▶ Published at SIGGRAPH 2007
- ▶ Very fast
 - ▶ ~1 second to find the best seam on **800x533** image
- ▶ “Content aware scaling” in Photoshop, others



The Seam carving Algorithm

- ▶ Function `find_least_important_seam(vals)`
 - ▶ **input:** `vals` is a 2D array of importance values
 - ▶ **output:** sequence of column indices that represents a seam

$$\begin{bmatrix} - & S & - & - \\ S & - & - & - \\ - & S & - & - \\ - & - & S & - \end{bmatrix} \longrightarrow [1, 0, 1, 2]$$

7x7 Importance Array

13	3	1	10	8	11	4
6	10	4	11	12	5	10
1	6	14	10	7	14	7
14	12	10	15	13	3	8
9	3	8	15	1	11	7
6	13	9	5	10	4	14
9	6	7	9	14	7	11

Seam = [6 , 5 , 4 , 5 , 4 , 5 , 5]

Data Structures Needed

- **costs**: 2D array filled in from bottom to top
 - **costs[row][col]**: importance of lowest-cost seam starting at **row** & **col**
- **dirs**: 2D array filled in at the same time as costs
 - **dirs[row][col]**: direction $(-1, 0, 1)$ of next pixel in lowest-cost seam starting at **row** & **col**

vals

3	6	8
5	7	2
4	9	3

costs

9	10	
4	9	3

dirs

↓	↘	↓
-	-	-

Data Structures Needed

vals

3	6	8
5	7	2
4	9	3

costs

9	10	
4	9	3

dirs

0	1	0
-	-	-

```
costs[row][col] = min(costs[row+1][col-1],  
                      costs[row+1][col],  
                      costs[row+1][col+1])  
                  + vals[row][col]
```

```
dirs[row][col] = -1 if min is costs[row+1][col-1]  
                 0 if min is costs[row+1][col]  
                 +1 if min is costs[row+1][col+1]
```


Simulating seam carving

vals

3	6	8
5	7	2
4	9	3

costs

4	9	3

dirs

Finding Least Important Seam

- ▶ Once **costs** is completely filled in
 - ▶ cell in top row with minimum value is the first pixel in least important seam
- ▶ Starting from that pixel
 - ▶ follow directions in **dirs** to find least important seam
 - ▶ and build its column index representation

Seamcarve Pseudocode

```
function find_least_important_seam(vals):
    dirs = 2D array with same dimensions as vals
    costs = 2D array with same dimensions as vals
    costs[height-1] = vals[height-1] // initialize bottom row of costs

    for row from height-2 to 0:
        for col from 0 to width-1:
            costs[row][col] = vals[row][col] +
                               min(costs[row+1][col-1],
                                   costs[row+1][col],
                                   costs[row+1][col+1])
            dirs[row][col] = -1, 0, or 1 // depending on min

    // Find least important start pixel
    min_col = argmin(costs[0]) // Returns index of min in top row

    // Create vertical seam of size 'height' by tracing from top
    seam = []
    seam[0] = min_col
    for row from 0 to height-2:
        seam[row+1] = seam[row] + dirs[row][seam[row]]

    return seam
```

What's `argmin`?

- ▶ What does `min` do?
 - ▶ returns minimum output of a function
- ▶ What does `argmin` do?
 - ▶ given function $f(x)$ returns x that minimizes $f(x)$
- ▶ $f(x) = -1 + x^2$
 - ▶ `min f = -1`
 - ▶ `argmin f = 0` // value for which f is -1
- ▶ Array `A = [5, 4, 1, 3, 9]`
 - ▶ `min(A) = 1`
 - ▶ `argmin(A) = 2` // the index of the minimum value

How fast is this algorithm?

```
function find_least_important_seam(vals):
    dirs = 2D array with same dimensions as vals
    costs = 2D array with same dimensions as vals
    costs[height-1] = vals[height-1] // initialize bottom row of costs

    for row from height-2 to 0:
        for col from 0 to width-1:
            costs[row][col] = vals[row][col] +
                               min(costs[row+1][col-1],
                                   costs[row+1][col],
                                   costs[row+1][col+1])
            dirs[row][col] = -1, 0, or 1 // depending on min

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    // Create vertical seam of size 'height' by tracing from top
    seam = []
    seam[0] = min_col
    for row from 0 to height-2:
        seam[row+1] = seam[row] + dirs[row][seam[row]]

    return seam
```

References

- ▶ Slide #5
 - ▶ A statue of Muhammad ibn Musa al-Khwarizmi; a persian scholar from the 9th century
 - ▶ “Algorithms” is derived from “Algoritmi” which is the Latin translation of his name
 - ▶ Worked in mathematics, astronomy and geometry
 - ▶ Founded the field of Algebra