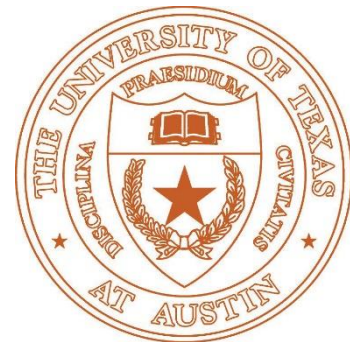
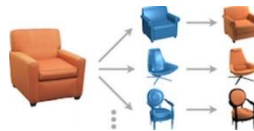
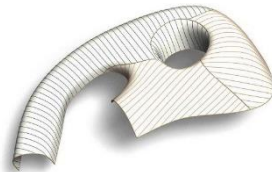
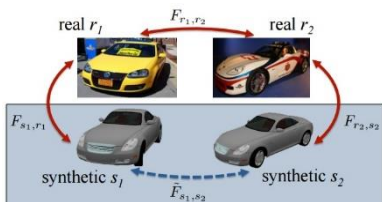
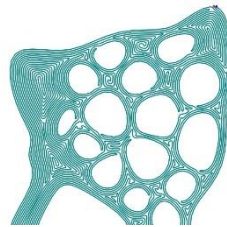


CS354 Computer Graphics

Computational Photography

Qixing Huang
April 23th 2018



Background

- Sales of digital cameras surpassed sales of film cameras in 2004



Digital Cameras

- Free film
- Instant display
- Quality surpass film
- Records metadata
 - Shooting parameters, camera location&orientation

Digital cameras

- Same experience as film cameras
 - Set zoom and focus
 - Set aperture and exposure
 - Press shutter to take a single picture
- Essentially, film camera with bits (0/1)?

Computational Photography: Definition

- Computational techniques that enhance or extend the capabilities of digital photography
- Output is an ordinary photograph, but one that could not have been taken by a traditional camera

Computational Photography: an Interdisciplinary Field

- Computer Graphics
- Computer Vision
- Image Processing
- Signal Processing
- Optics
- Embedded Systems

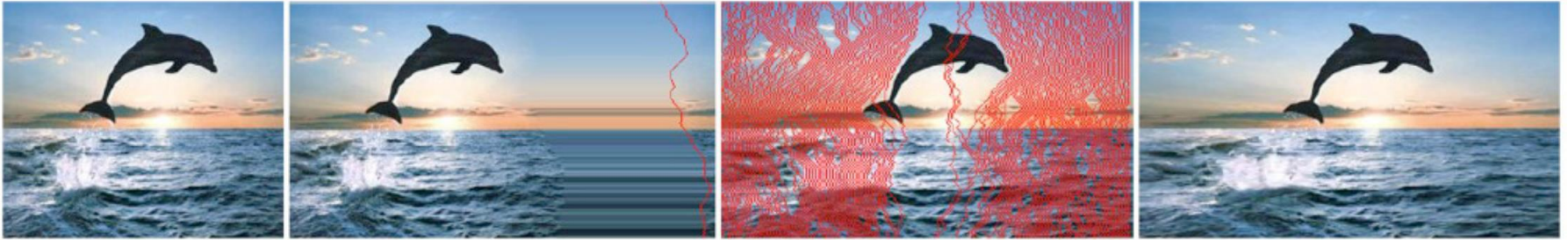
Digital Photography

Digital Photography

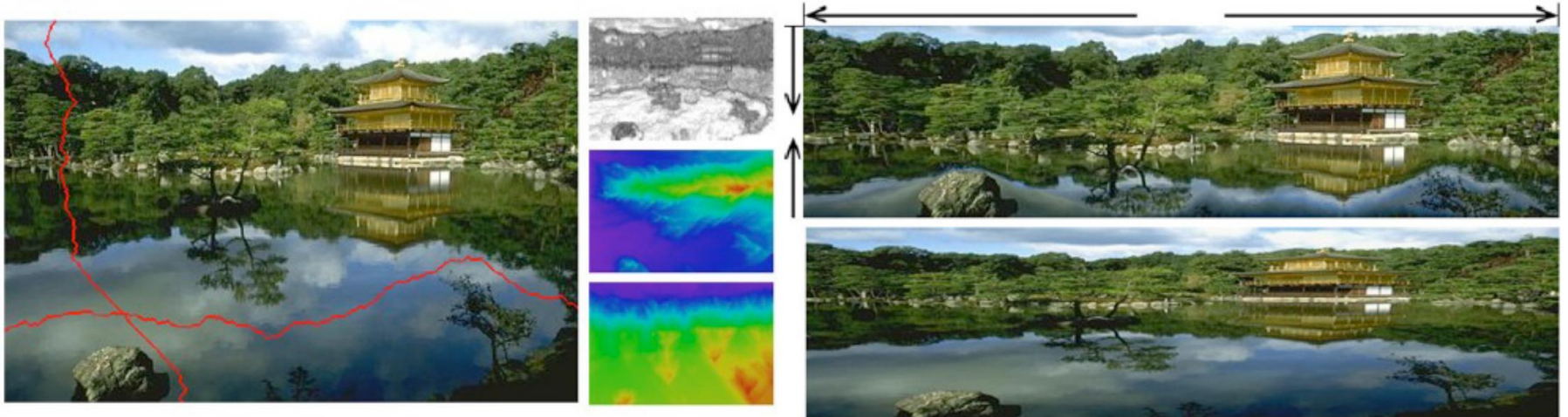
- Image processing applied to captured images to produce better images
- Examples: Interpolation, Filtering, Enhancement, Dynamic Range Compression, Color Management, Morphing, Hole Filling, Artistic Image Effects, Image Compression, Watermarking.

Seam Carving for Content-Aware Image Resizing

Avidan, Shamir (SIGGRAPH 2007)



- To expand: insert pixel along seams that, if removed, will yield original image



Seam Carving for Content-Aware Image Resizing

Avidan, Shamir (SIGGRAPH 2007)

- To contract: remove pixels along the lowest-energy seams, found with dynamic programming
- Object removal for an application?



A Bayesian Approach to Digital Matting

Chuang et al. (CVPR 2001)

- Generate local color model for foreground, background
- Probabilistically assign alpha to unclassified pixels



Removing Camera Shake from a Single Image

Fergus et al. (SIGGRAPH 2006)



Fast Motion Deblurring

Cho, Lee (SIGGRAPH Asia 2009)



Input blurred image

Deblurring result

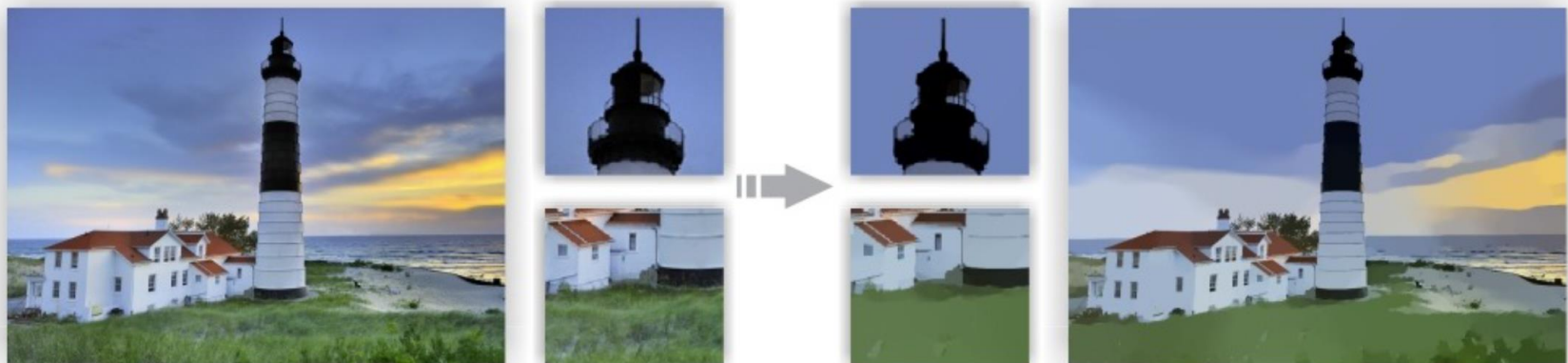
Magnified views

Local Laplacian Filters: Edge-aware Image Processing with a Laplacian Pyramid

Paris, Hasinoff, Kautz (SIGGRAPH 2011)



- Image Smoothing via L0 Gradient Minimization
Xu et al. (SIGGRAPH Asia 2011)



Computational Processing

Computational Processing

- Processing of a set of captured images to create new images
- Examples:
 - Mosaicing, Matting, Super-Resolution, Multi-Exposure HDR, Light Field from, Multiple View, Structure from Motion, Shape from X.

Interactive Digital Photomontage Agarwala et al. (SIGGRAPH 2004)



Interactive Digital Photomontage Agarwala et al. (SIGGRAPH 2004)



Interactive Digital Photomontage Agarwala et al. (SIGGRAPH 2004)



Interactive Digital Photomontage Agarwala et al. (SIGGRAPH 2004)

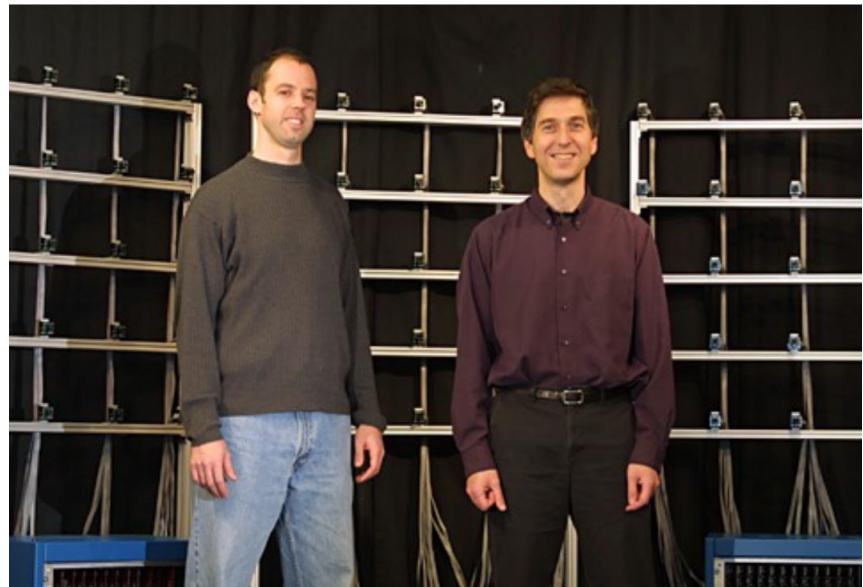
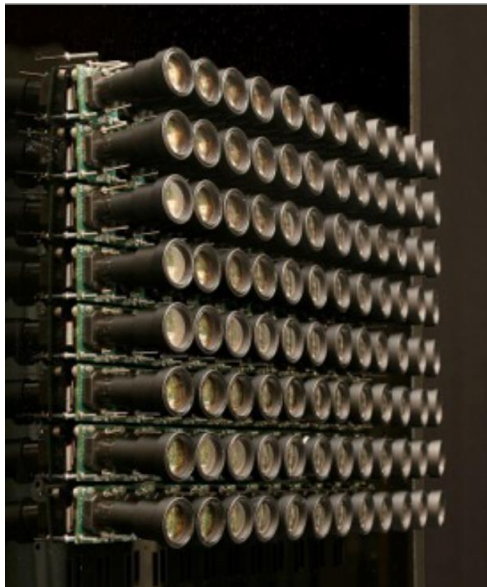


High Performance Imaging using Large Camera Arrays

Wilburn et al. (SIGGRAPH 2005)

640 x 480 pixels x
30 fps x 128 cameras

synchronized timing
continuous streaming
flexible arrangement



High Performance Imaging using Large Camera Arrays

Wilburn et al. (SIGGRAPH 2005)

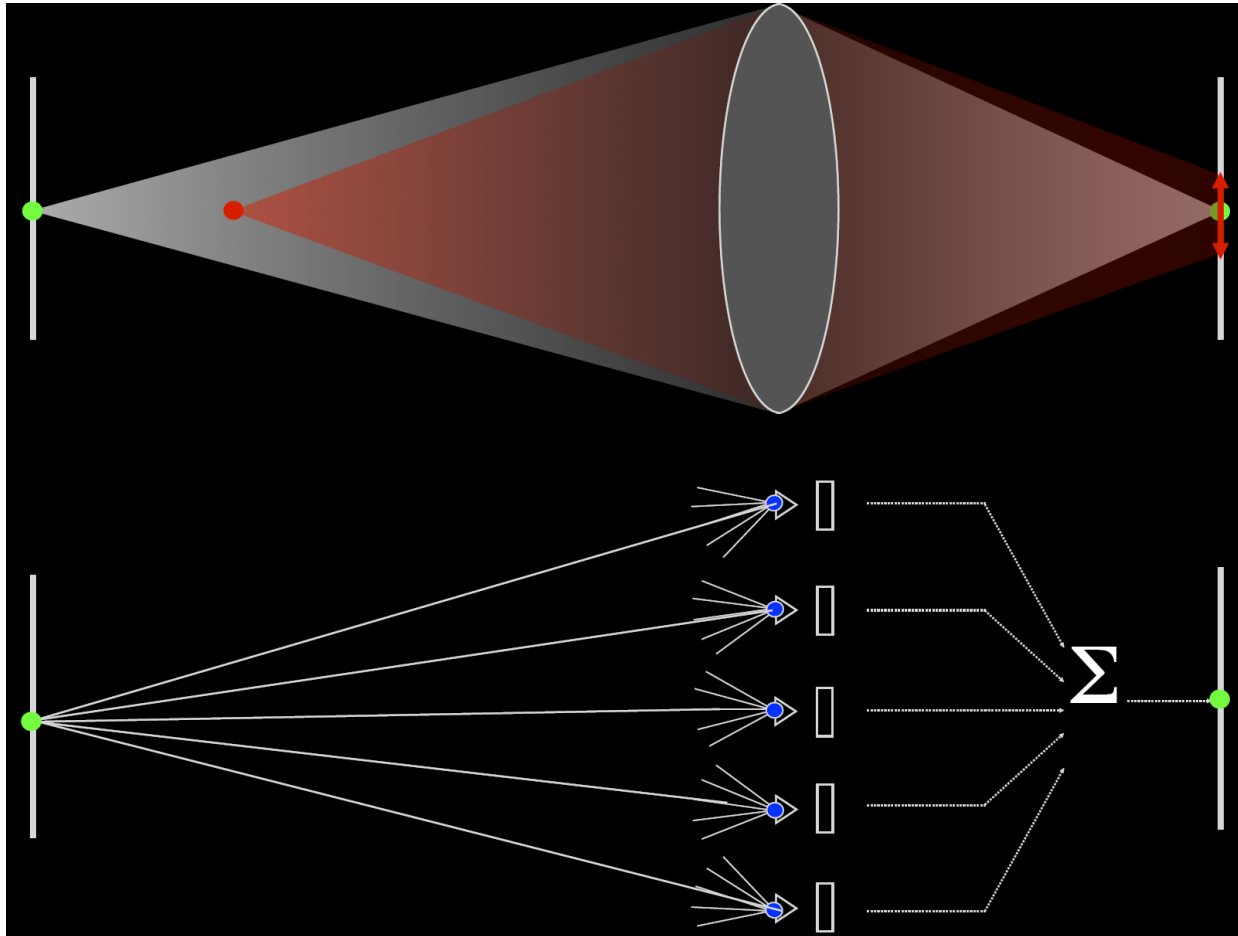


Image Deblurring with Blurry/Noisy Image Pairs

Yuan et al. (SIGGRAPH 2007)



long exposure
(blurry)



short exposure
(dark)



same, scaled up
(noisy)



joint
deconvolution

Other Interesting Topics

Bilateral Filtering

$$I^{\text{filtered}}(x) = \frac{1}{W_p} \sum_{x_i \in \Omega} I(x_i) f_r(\|I(x_i) - I(x)\|) g_s(\|x_i - x\|)$$

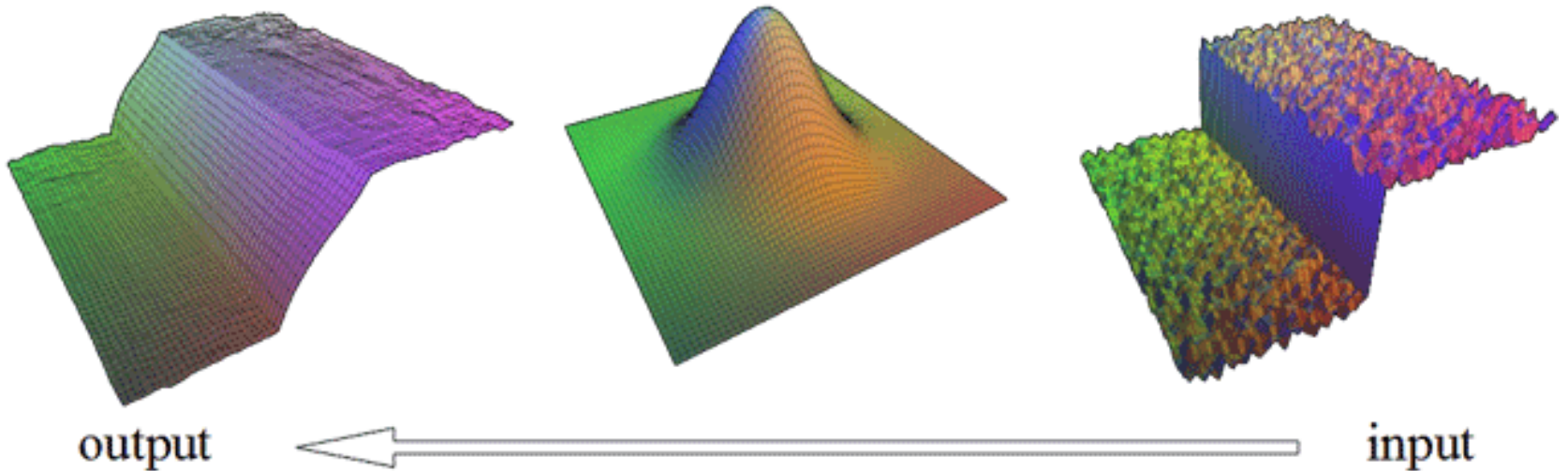
$$W_p = \sum_{x_i \in \Omega} f_r(\|I(x_i) - I(x)\|) g_s(\|x_i - x\|)$$

$$w(i, j, k, l) = \exp\left(-\frac{(i - k)^2 + (j - l)^2}{2\sigma_d^2} - \frac{\|I(i, j) - I(k, l)\|^2}{2\sigma_r^2}\right)$$

$$I_D(i, j) = \frac{\sum_{k, l} I(k, l) w(i, j, k, l)}{\sum_{k, l} w(i, j, k, l)}$$

Standard Filtering

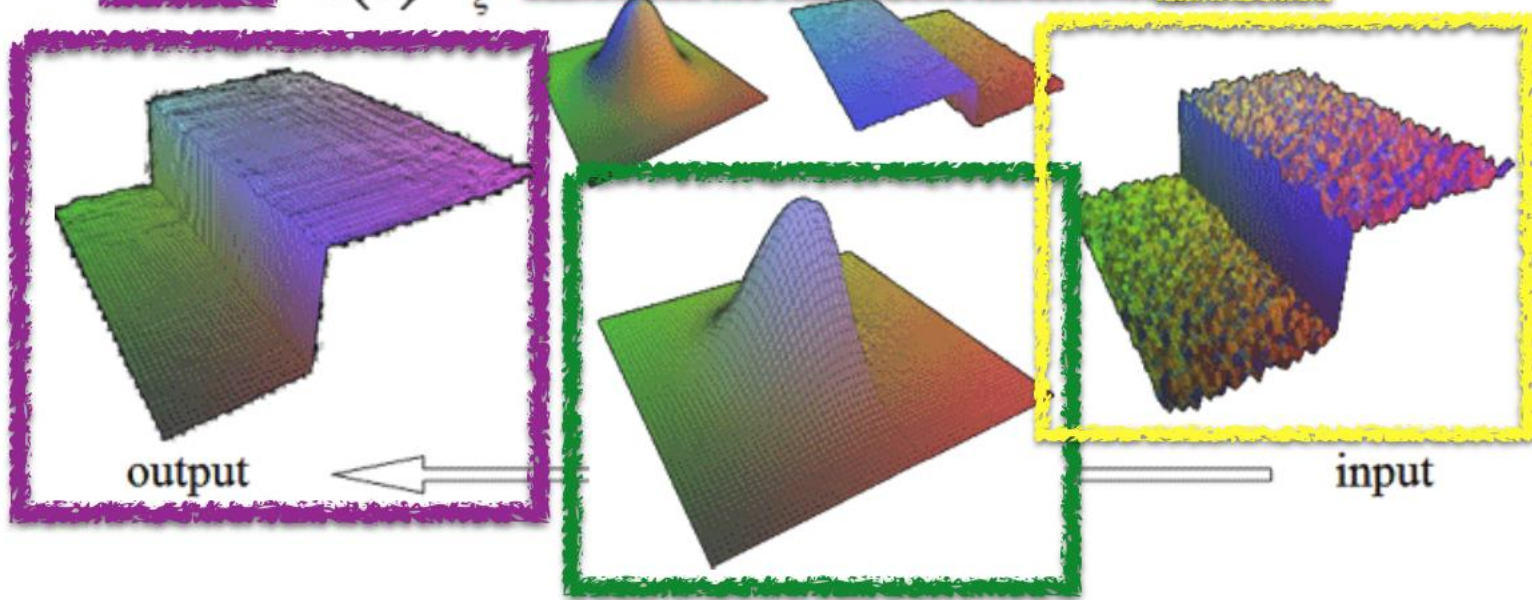
$$J(x) = \sum_{\xi} f(x, \xi) I(\xi)$$



Bilateral Filtering

Output image Combine spatial and intensity filters Input image

$$J(x) = \frac{1}{k(x)} \sum_{\xi} f(x, \xi) \quad g(I(\xi) - I(x)) \quad I(\xi)$$



PatchMatch

[Barnes et al. 2009]

PatchMatch: A Randomized Correspondence Algorithm for Structural Image Editing

Connelly Barnes¹

Eli Shechtman^{2,3}

Adam Finkelstein¹

Dan B Goldman²

¹Princeton University

²Adobe Systems

³University of Washington



Figure 1: Structural image editing. Left to right: (a) the original image; (b) a hole is marked (magenta) and we use line constraints (red/green/blue) to improve the continuity of the roofline; (c) the hole is filled in; (d) user-supplied line constraints for retargeting; (e) retargeting using constraints eliminates two columns automatically; and (f) user translates the roof upward using reshuffling.

PatchMatch

[Barnes et al. 2009]

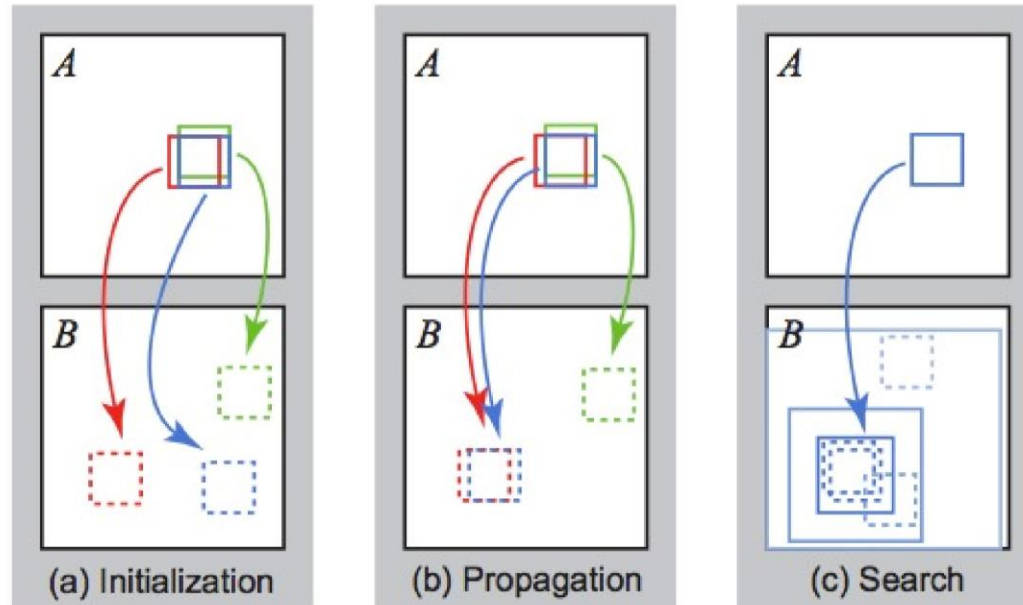
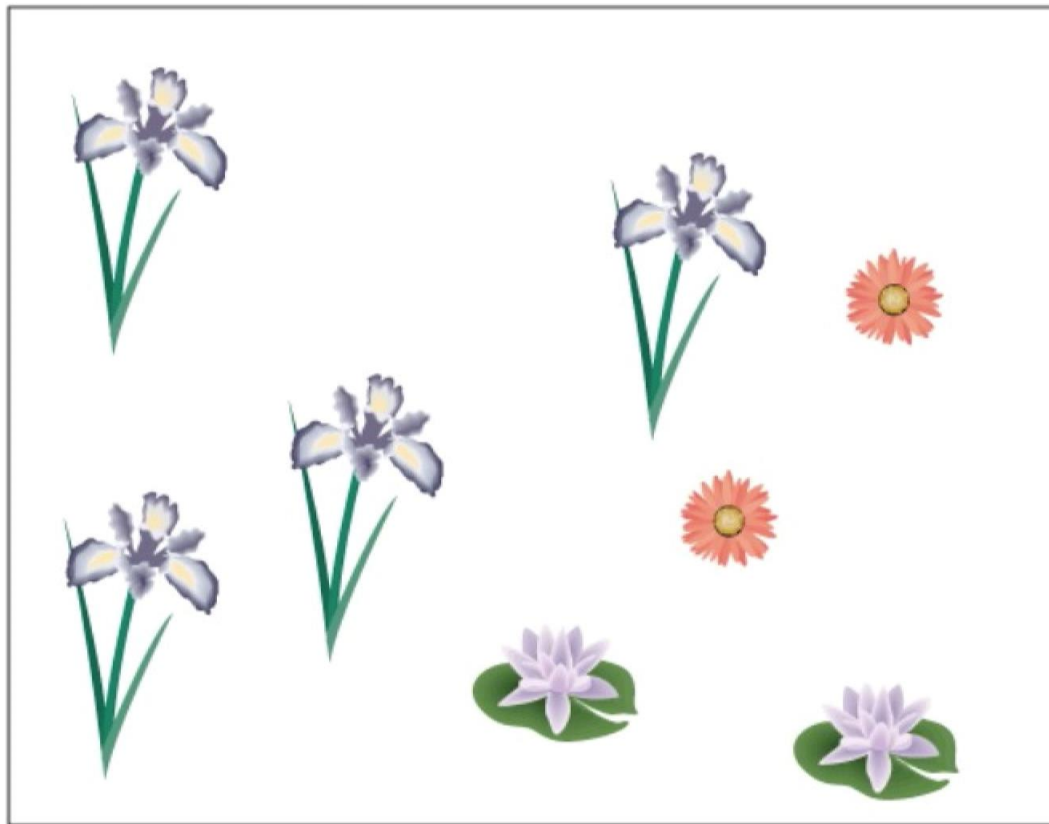


Figure 2: *Phases of the randomized nearest neighbor algorithm: (a) patches initially have random assignments; (b) the blue patch checks above/green and left/red neighbors to see if they will improve the blue mapping, propagating good matches; (c) the patch searches randomly for improvements in concentric neighborhoods.*

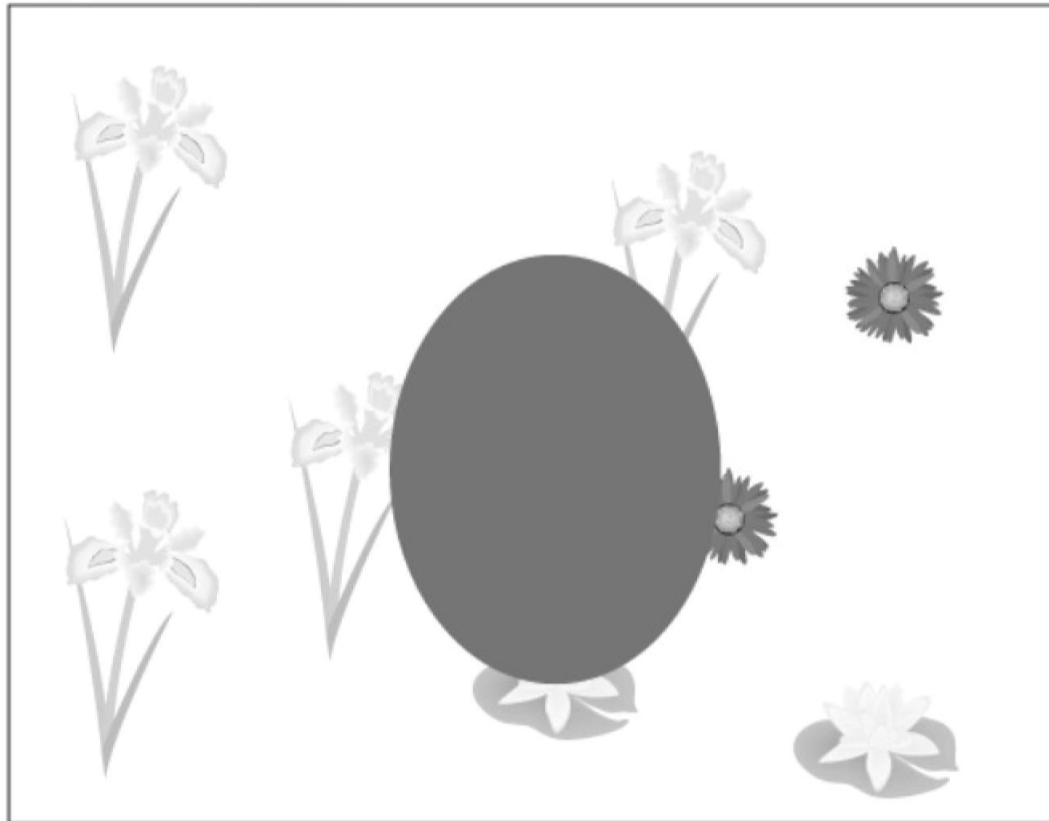
PatchMatch

[Barnes et al. 2009]



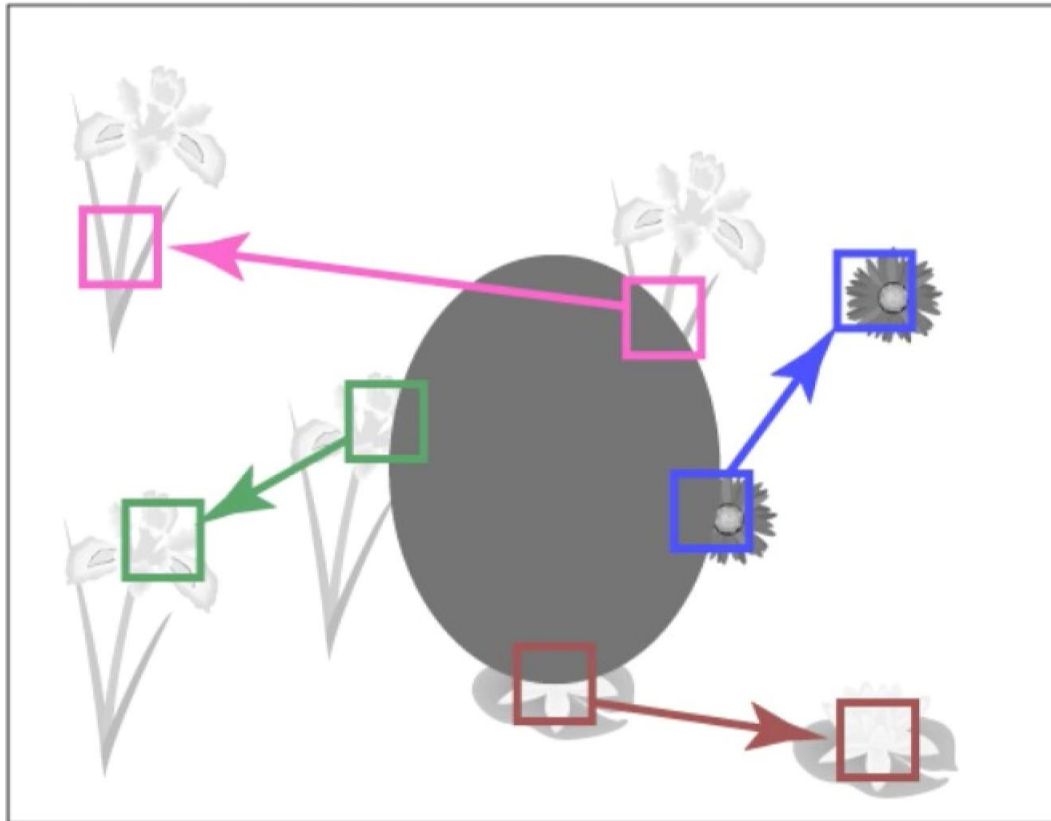
PatchMatch

[Barnes et al. 2009]



PatchMatch

[Barnes et al. 2009]



Scene Completion

[Hays and Efros 2007]

Scene Completion Using Millions of Photographs

James Hays

Alexei A. Efros

Carnegie Mellon University

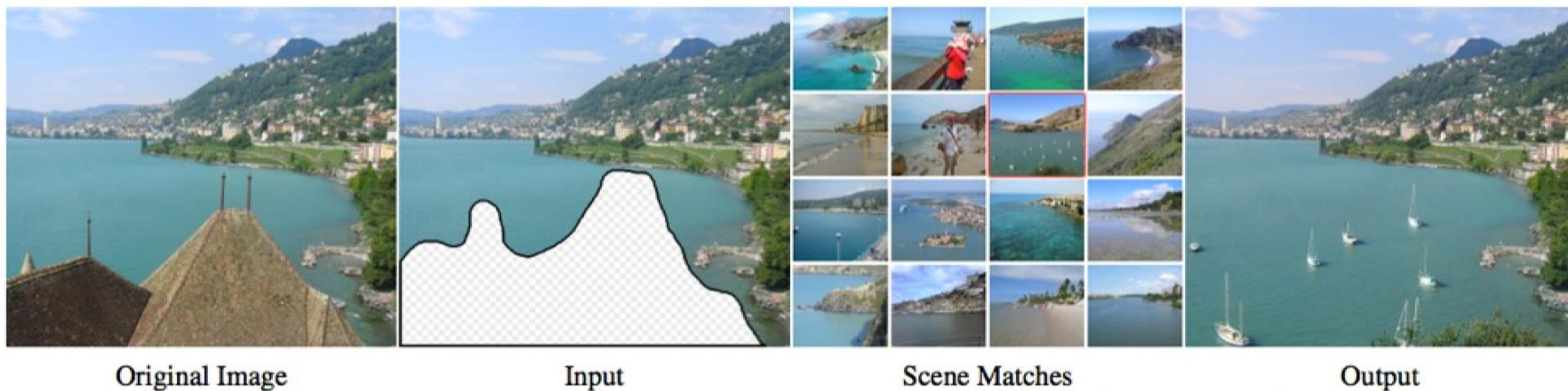
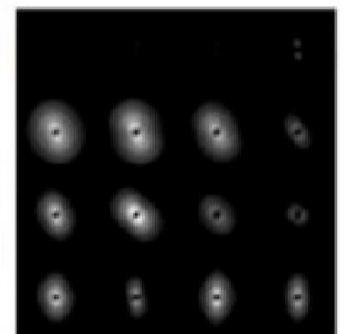
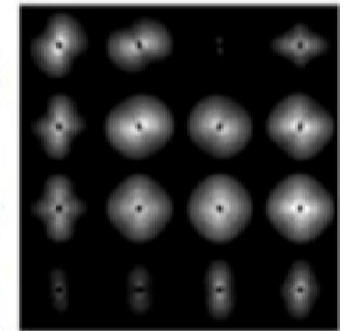


Figure 1: Given an input image with a missing region, we use matching scenes from a large collection of photographs to complete the image.

Scene Completion

- GIST [Oliva and Torralba 2006] encodes scene semantics
- Histograms of oriented edge filter responses in coarse spatial bins at multiple scales
- Only works for semantic matching with HUGE datasets



Scene Completion

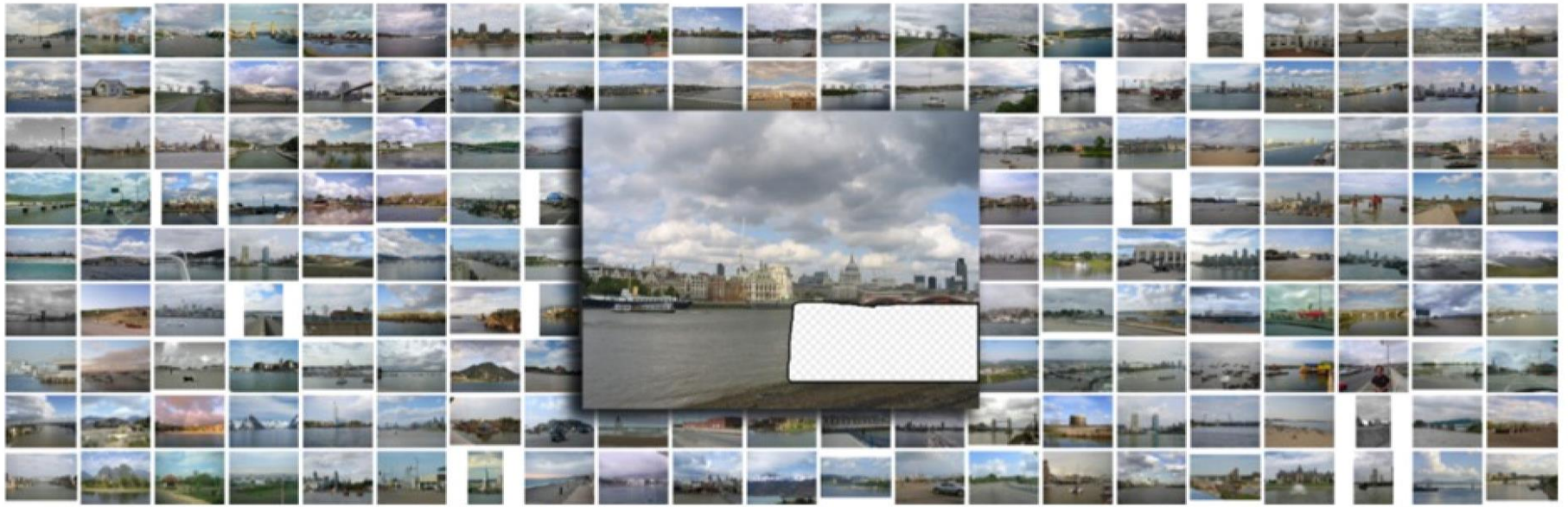
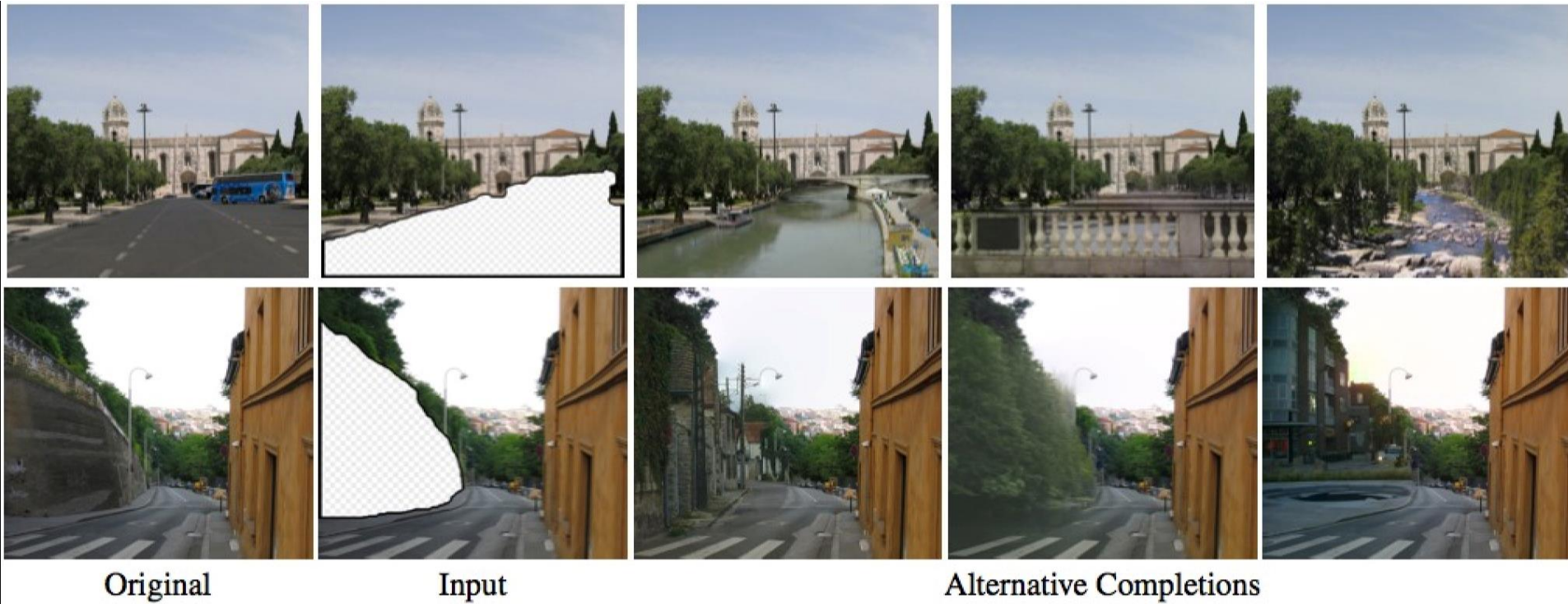


Figure 3: The 164 closest scenes to the incomplete image in the center. Most of the scenes are semantically and structurally similar; many are even from the same city (London).

- Show top N choices to user
- Composite using Graphcut and Poisson blending

Scene Completion



Phototourism

Photo Tourism

Exploring photo collections in 3D

Noah Snavely Steven M. Seitz Richard Szeliski
University of Washington *Microsoft Research*

SIGGRAPH 2006

Next Lecture

- Computational Imaging/Optics
- Computational Sensor
- Computational Illumination

Discussion