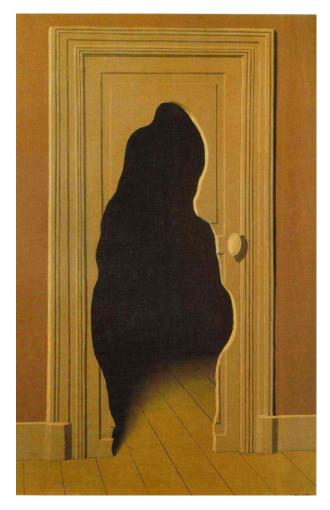
Leveraging Big Data: Photo Completion



René Magritte, "The Unexpected Answer"

CSC320: Introduction to Visual Computing Michael Guerzhoy

Slides from Alyosha Efros, Derek Hoiem

Google and massive data-driven algorithms

A.I. for the postmodern world:

- all questions have already been answered...many times, in many ways
- Google is dumb, the "intelligence" is in the data

💥 Google Search: clime stairs - Netscape			
File Edit V	💥 Google Search: clime punishment - Netscape		
Back	File Edit View Go Communicator Help		
Back	I 🗳 🔉 🤁 🐴 🧟 🛍 📥 💕 🚳 🏨	N	
🧃 🦋 Bo	Back Forward Reload Home Search Netscape Print Security Shop Stop		
🥈 🖳 Web	👔 🦋 Bookmarks 🙏 Location: http://www.google.com/search?hl=en&lr=&ie=ISO-8859-1&q=clime+punishment	💽 🍘 What's Related	
	👔 🖳 WebMail 🖳 Calendar 🖳 Radio 🖳 People 🖳 Yellow Pages 🖳 Download 🖳 Customize		
Advanced Search Preferences Language Tools Search Tips			
	Clime punishment		
	Google Search		
Web			
Searche	Web Images Groups Directory News		
Obdronk	Web Images Groups Directory News Searched the web for <u>clime punishment</u> . Results 1 - 10 of about 4,250. Search took 0.06 second		
Didyo		LUUK U.UO SECUNU	
Did yo			
	Did you mean: <u>crime punishment</u>		

Google Translate

Google translate

From: English - detected 🔻 🚍 To: Spanish 🔻 Translate	English to Spanish translation
My dog once ate three oranges, but then it died.	Mi perro se comió una vez tres naranjas, pero luego murió.
Listen	

Chinese Room

• John Searle (1980)





Computer Graphics Proceedings, Annual Conference Series, 2007

Scene Completion Using Millions of Photographs

James Hays Alexei A. Efros Carnegie Mellon University



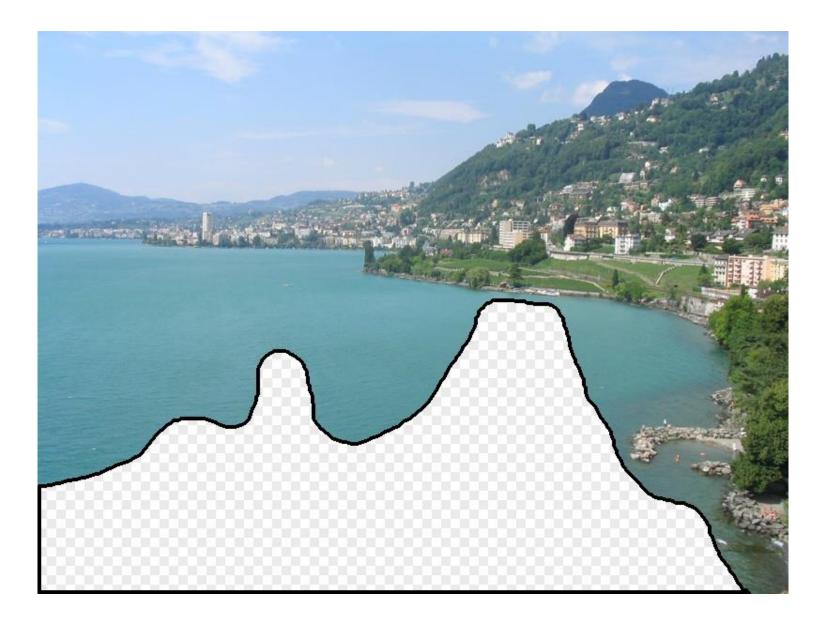
Original Image

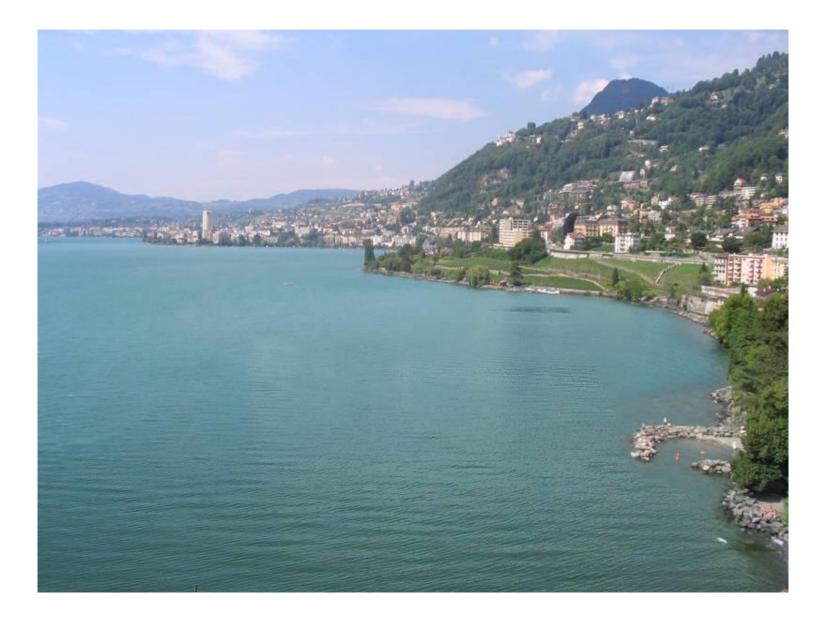
Input

Scene Matches

Output

What should the missing region contain?



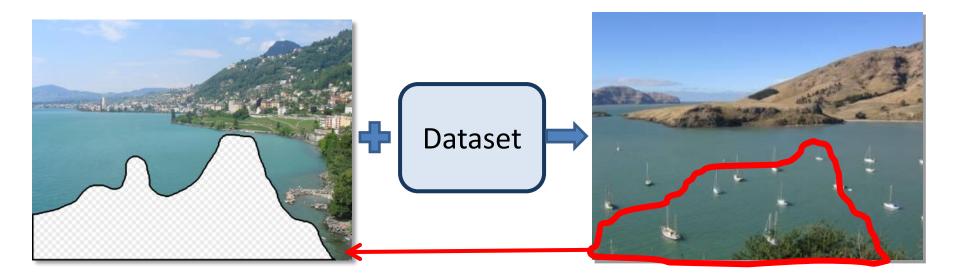




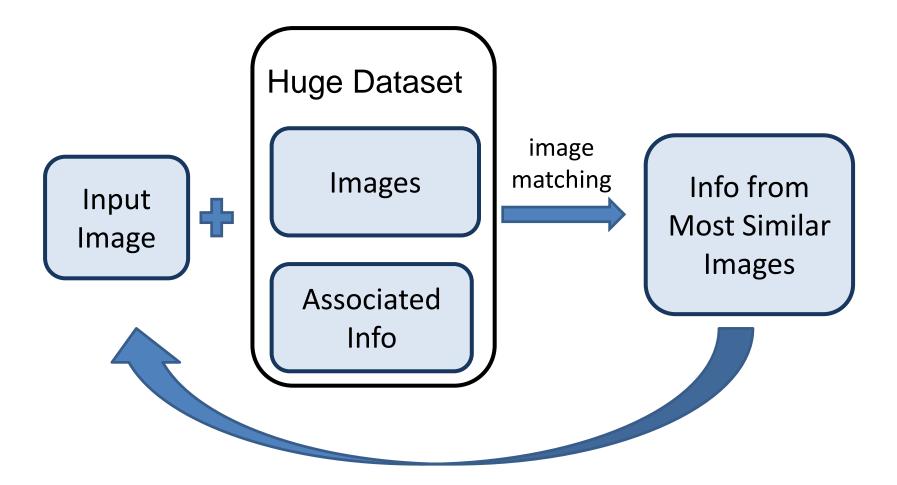


How it works

- Find a similar image from a large dataset
- Blend a region from that image into the hole



General Principal



Trick: If you have enough images, the dataset will contain very similar images that you can find with simple matching methods.

How many images is enough?

















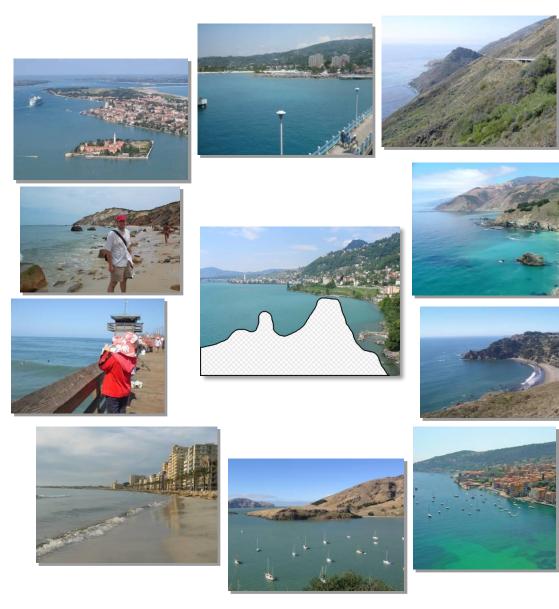








Nearest neighbors from a collection of 20 thousand images



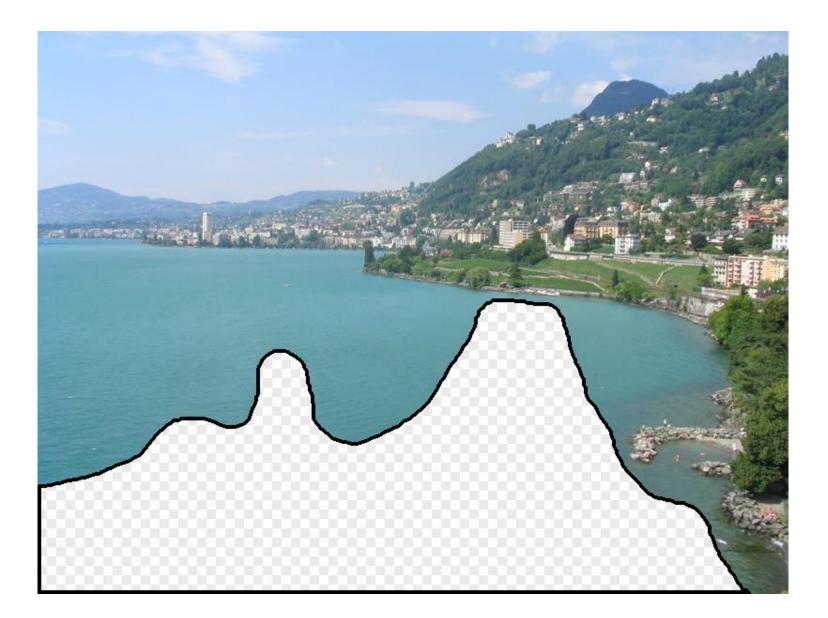
Nearest neighbors from a collection of 2 million images

Image Data on the Internet

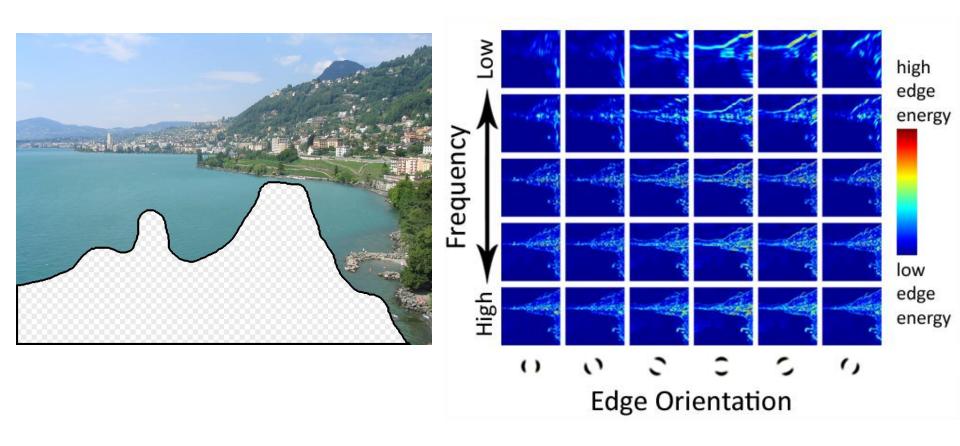
- Flickr (now)
 - 6 billion images per month
 - More than 100 petabytes of images/video
- Flickr (as of Sept. 19th, 2010)
 - 5 billion photographs
 - 100+ million geotagged images
- Imageshack (as of 2009)
 - 20 billion
- Facebook (as of 2009)
 - 15 billion

http://royal.pingdom.com/2010/01/22/internet-2009-in-numbers/

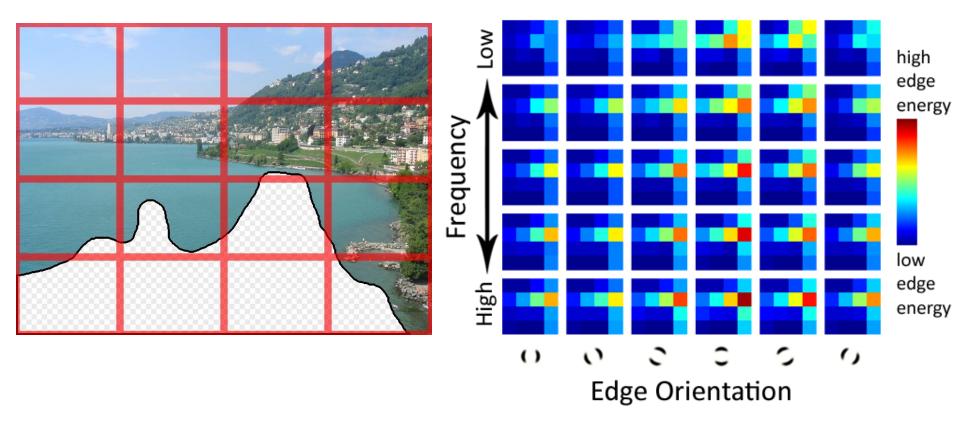
Scene Matching



Scene Descriptor

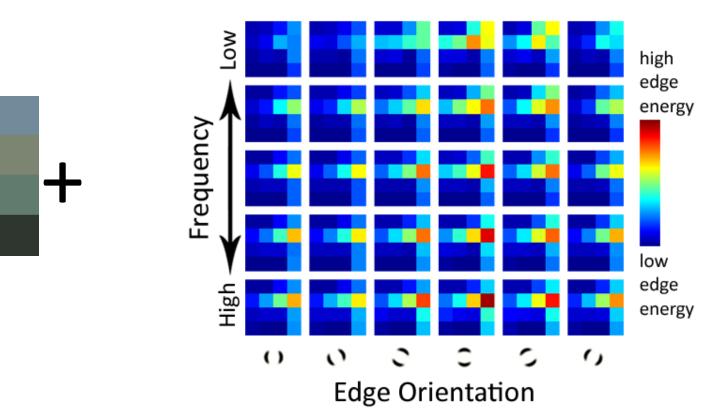


Scene Descriptor



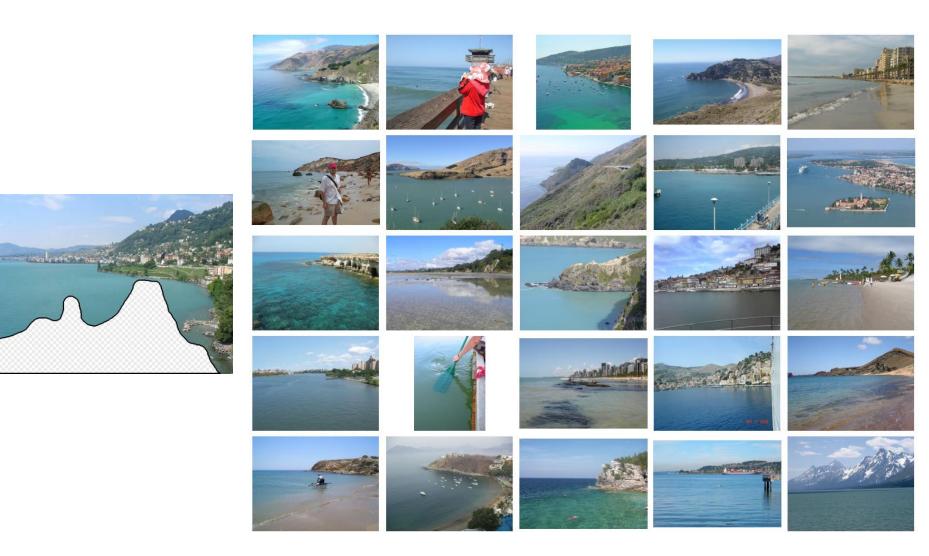
Scene Gist Descriptor (Oliva and Torralba 2001)

Scene Descriptor



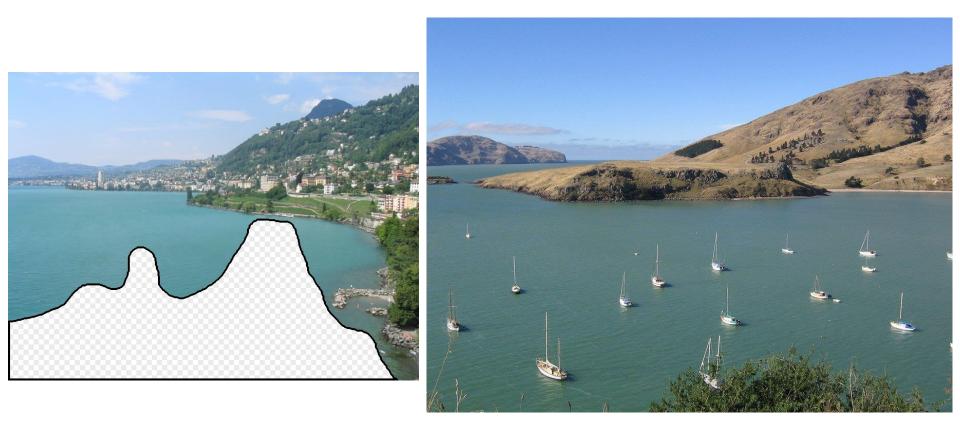
Scene Gist Descriptor (Oliva and Torralba 2001)

2 Million Flickr Images



... 200 total

Context Matching



Find the best seam + blend

