## Multi-Perspective Panoramas



CS194: Image Manipulation \& Computational Photography

## Objectives

## 1. Better looking panoramas

2. Let the camera move:

- Any view
- Natural photographing


## Stand on the shoulders of giants



## Cartographic projections



Cylindrical


Conical

# Common panorama projections 

Perspective
Stereographic


Cylindircal


## Global Projections

## Perspective



Stereographic


Cylindircal


## Learn from the artists

Multiple view points


De Chirico "Mystery and Melancholy of a Street", 1914

## Renaissance painters solution


"School of Athens", Raffaello Sanzio ~1510
Give a separate treatment to different parts of the scene!!

## Personalized projections


"School of Athens", Raffaello Sanzio ~1510
Give a separate treatment to different parts of the scene!!

## Multiple planes of projection

Sharp discontinuities can often be well hidden


## Single view


multi-view result


## Single view



## multi-view result



## Single view



## multi-view result



## Single view


multi-view result


## Objectives - revisited

## 1. Better looking panoramas

2. Let the camera move:

- Any view
- Natural photographing


## Multiple views can live together

## Multi-view compositions



David Hockney, Place Furstenberg, (1985)

## Why multi-view?

Multiple viewpoints


David Hockney,
Place Furstenberg, 1985

Single viewpoint


Melissa Slénin,
Place Furstenberg, 2003

## Long Imaging



Agarwala et al. (SIGGRAPH 2006)

## Smooth Multi-View



Google maps

## What's wrong in the picture?



## Google maps

## Non-smooth



## Google maps

## The Chair



David Hockney (1985)

## Joiners are popular



Flickr statistics (Aug'07):
4,985 photos matching joiners.
4,007 photos matching Hockney
41 groups about Hockney
Thousands of members

## Main goals:

## Automate joiners

## Generalize panoramas to general image collections

## Objectives

- For Artists:

Reduce manual labor


Manual: ~40min.
Fully automatic

## Objectives

- For Artists:

Reduce manual labor

- For non-artists:

Generate pleasing-to-the-eye joiners

## Objectives

- For Artists:

Reduce manual labor

- For non-artists:

Generate pleasing-to-the-eye joiners

- For data exploration: Organize images spatially


## What's going on here?



A cacti garden


## Principles

## Principles

- Convey topology


Correct


Incorrect

## Principles

- Convey topology
- A 2D layering of images


Blending:
blurry


Graph-cut: cuts hood


Desired joiner

## Principles

- Convey topology
- A 2D layering of images
- Don'† distort images

translate

rotate

scale


## Principles

- Convey topology
- A 2D layering of images
- Don'† distort images
- Minimize inconsistencies


Algorithm

## Step 1: Feature matching



Brown \& Lowe, ICCV'03

## Step 2: Align



Large inconsistencies
Brown \& Lowe, ICCV'03

## Step 3: Order



Reduced inconsistencies

## Ordering images

Try all orders: only for small datasets

## Ordering images

Try all orders: only for small datasets
complexity: $(m+n) \alpha$ $\mathrm{m}=$ \# images
n = \# overlaps
$\alpha=\#$ acyclic orders


## Ordering images

Observations:

- Typically each image overlaps with only a few others
- Many decisions can be taken locally



## Ordering images

Approximate solution:

- Solve for each image independently
- Iterate over all images



## Can we do better?



## Step 4: Improve alignment



## Iterate Align-OrderImportance



## Iterative refinement

Initial


Final


## Iterative refinement

Initial


Final


## Iterative refinement

Initial


Final


## What is this?



That's me reading


## Anza-Borrego



## Tractor



## Manual by Photographer



## Our automatic result



## Failure?



## GUI



## The Impossible Bridge



Homage to David Hockney


## Take home



- A highly related work: "Scene Collages and Flexible Camera Arrays," Y. Nomura, L. Zhang and S.K. Nayar, Eurographics Symposium on Rendering, Jun, 2007.



## This Class Project from 2007



