	Announcements
	<ul> <li>Final project presentation on 6/28 1:30pm in Room 101</li> <li>What to hand in?</li> </ul>
Textures & Image-Based Lighting	
Digital Visual Effects, Spring 2005	
Yung-Yu Chuang	
2005/6/15	
with slides by Alex Efros, Li-Yi Wei and Paul Debevec	
Outline DigiVEX	
Texture synthesis	
<ul> <li>Acceleration by multi-resolution and TSVQ</li> </ul>	
<ul> <li>Patch-based texture synthesis</li> </ul>	
Image analogies	
Image-based lighting	Texture synthesis



- Given a finite sample of some texture, the goa is to synthesize other samples from that same texture.
  - The sample needs to be "large enough"



#### The challenge

- How to capture the essence of texture?
- Need to model the whole spectrum: from repeated to stochastic texture



#### Motivation from language



- [Shannon'48] proposed a way to generate English-looking text using N-grams:
  - Assume a generalized Markov model
  - Use a large text to compute probability distributions of each letter given N-1 previous letters
    - precompute or sample randomly
  - Starting from a seed repeatedly sample this Markov chain to generate new letters
  - One can use whole words instead of letters too.



#### Mark V. Shaney (Bell Labs)

- Results (using <u>alt.singles</u> corpus):
  - "One morning I shot an elephant in my arms and kissed him."
  - "I spent an interesting evening recently with a grain of salt"
- Notice how well local structure is preserved!
  - Now let's try this in 2D...

#### Ideally



- Assuming Markov property, what is conditional probability distribution of p, given the neighbourhood window?
- Instead of constructing a model, let's directly search the input image for all such neighbourhoods to produce a histogram for p
- To synthesize p, just pick one match at random



- However, since our sample image is finite, an exact neighbourhood match might not be present
- So we find the best match using SSD error (weighted by a Gaussian to emphasize local structure), and take all samples within some distance from that match
- Using Gaussian-weighted SSD is very important

#### Neighborhood size matters









#### Inpainting





**Digi**VFX

- Growing is in "onion peeling" order
  - within each "layer", pixels with most neighbors are synthesized first

#### Inpainting



#### Inpainting

Digi<mark>VFX</mark>



#### Results







#### Recent inpaiting algorithms

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#### Obtain structure first, add details by texture synthesis



#### Summary of the basic algorithm



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• Exhaustively search neighborhoods



#### Neighborhood

#### DigiVFX

Neighborhood size determines the quality & cost



#### Summary

- Advantages:
  - conceptually simple
  - models a wide range of real-world textures
  - naturally does hole-filling
- Disadvantages:
  - it's slow
  - it's a heuristic

#### Acceleration by Wei & Levoy



DigiVFX

- Multi-resolution
- Tree-structure

#### Multi-resolution pyramid













5 levels $5 \times 5$ 

#### Results



#### Failures

#### Non-planar structures

Global information



#### Acceleration

DigiVFX

DigiVFX

Computation bottleneck: neighborhood search



#### Nearest point search

#### Digi<mark>VFX</mark>

• Treat neighborhoods as high dimensional points

Neighborhood



High dimensional point/vector







#### Philosophy

- DigiVFX
- The "Corrupt Professor's Algorithm":
  - Plagiarize as much of the source image as you can
  - Then try to cover up the evidence
- Rationale:
  - Texture blocks are by definition correct samples of texture so problem only connecting them together

#### Algorithm

- Pick size of block and size of overlap
- Synthesize blocks in raster order



- Search input texture for block that satisfies overlap constraints (above and left)
- Paste new block into resulting texture
  - blending
  - use dynamic programming to compute minimal error boundary cut







### GraphCut textures



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#### Photomontage



#### Photomontage



#### Photomontage









# Image Analogies Implementation



## Image Analogies Implementation



# Image Analogies Implementation

Balance between approximate and coherence searches

```
 \begin{array}{l} \textbf{function } \text{BestMatch}(A,\,A',\,B,\,B',\,s,\,\ell,\,q) \text{:} \\ p_{\text{app}} \leftarrow \text{BestApproximateMatch}(A,\,A',\,B,\,B',\,\ell,\,q) \\ p_{\text{coh}} \leftarrow \text{BestCoherenceMatch}(A,\,A',\,B,\,B',\,s,\,\ell,\,q) \\ d_{\text{app}} \leftarrow \|F_{\ell}(p_{\text{app}}) - F_{\ell}(q)\|^{2} \\ d_{\text{coh}} \leftarrow \|F_{\ell}(p_{\text{coh}}) - F_{\ell}(q)\|^{2} \\ \textbf{if } d_{\text{coh}} \leq d_{\text{app}}(1 + 2^{\ell - L}\kappa) \textbf{ then} \\ \textbf{return } p_{\text{coh}} \\ \textbf{else} \\ \textbf{return } p_{\text{app}} \end{array}
```

#### Learn to blur



Unfiltered source (A)

Filtered source (A')



Unfiltered target (B)



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Filtered target (B')





#### Super-resolution



#### Colorization





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#### Artistic filters

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В

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Unfiltered source (A)



There's source (A)





#### Texture by numbers





Texture by numbers

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# **Image Analogies**

Aaron Hertzmann Charles Jacobs Nuria Oliver Brian Curless David Salesin Image-based lighting

#### Rendering

- DigiVFX
- Rendering is a function of geometry, reflectance, lighting and viewing.
- To synthesize CGI into real scene, we have to match the above four factors.
- Viewing can be obtained from *calibration* or *structure from motion*.
- Geometry can be captured using *3D photography* or made by hands.
- How to capture lighting and reflectance?

#### HDRI Sky Probe



#### Clipped Sky + Sun Source





















### Real Scene Example



• Goal: place synthetic objects on table

#### Light Probe / Calibration Grid





## Modeling the Scene

#### Digi<mark>VFX</mark>





#### The *Light-Based* Room Model







#### Rendering into the Scene



• Background Plate

#### Rendering into the scene





Objects and Local Scene matched to Scene

#### **Differential rendering**





• Local scene w/o objects, illuminated by model



#### Differential rendering

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# Environment map from single image? Digivex





#### Eye as light probe! (Nayar et al)





#### Cornea is an ellipsoid

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Figure 2: (a) An external view of the human eye. (b) A normal adult cornea can be modeled as an ellipsoid whose outer limit corresponds to the limbus. The eccentricity and radius of curvature at the apex can be assumed to be known.

#### Ellipsoid fitting





#### Results



(a1) original image













DigiVFX

#### Reflectance

#### The Bidirectional Reflection Distribution Function

– Given an incoming ray  $(\theta_i, \phi_i)$  and outgoing ray  $(\theta_e, \phi_e)$ what proportion of the incoming light is reflected along out



Answer given by the BRDF:  $ho( heta_i,\phi_i, heta_e,\phi_e)$ 



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#### Capturing reflectance





# Application in "The Matrix Reloaded"



#### Reference

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