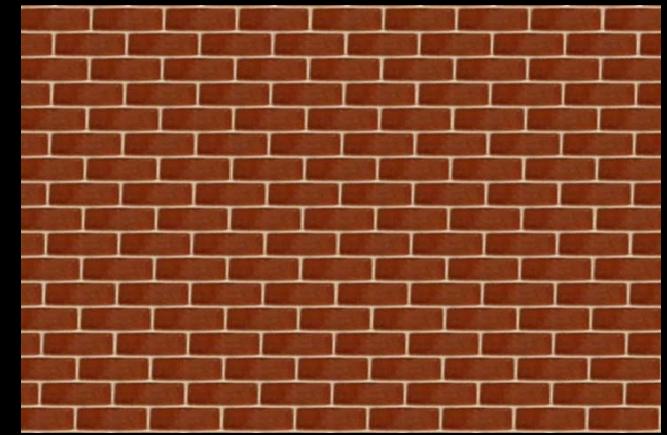
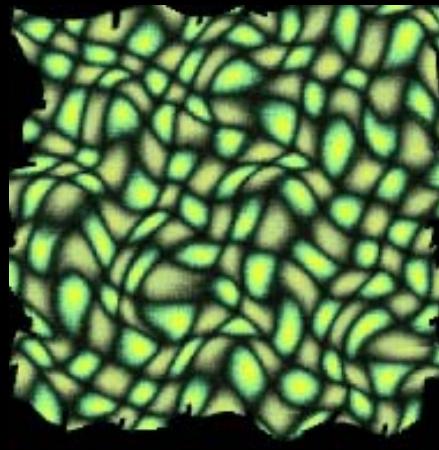




# Near-Regular Texture Analysis and Manipulation

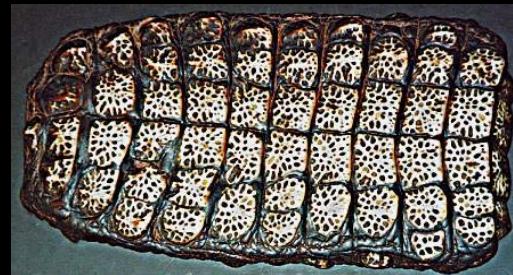
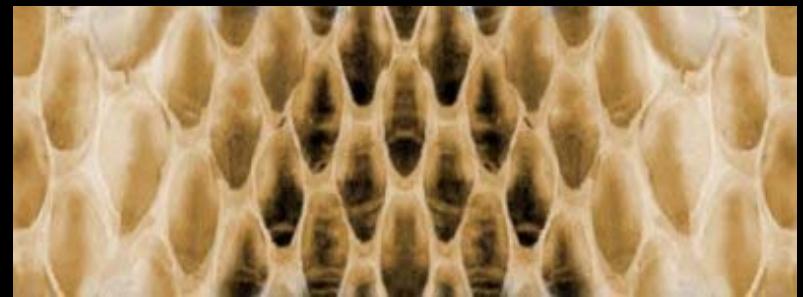
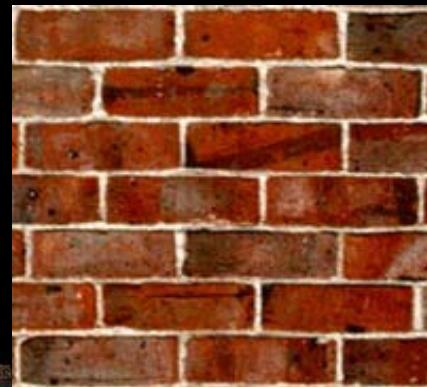
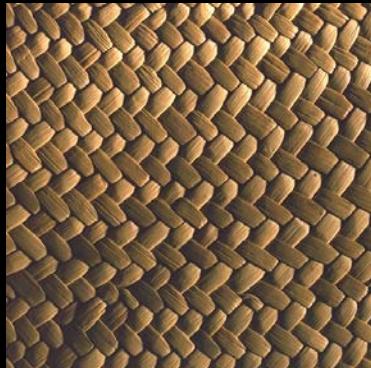
---

**Yanxi Liu, Wen-Chieh Lin and James Hays**  
**Carnegie Mellon University**

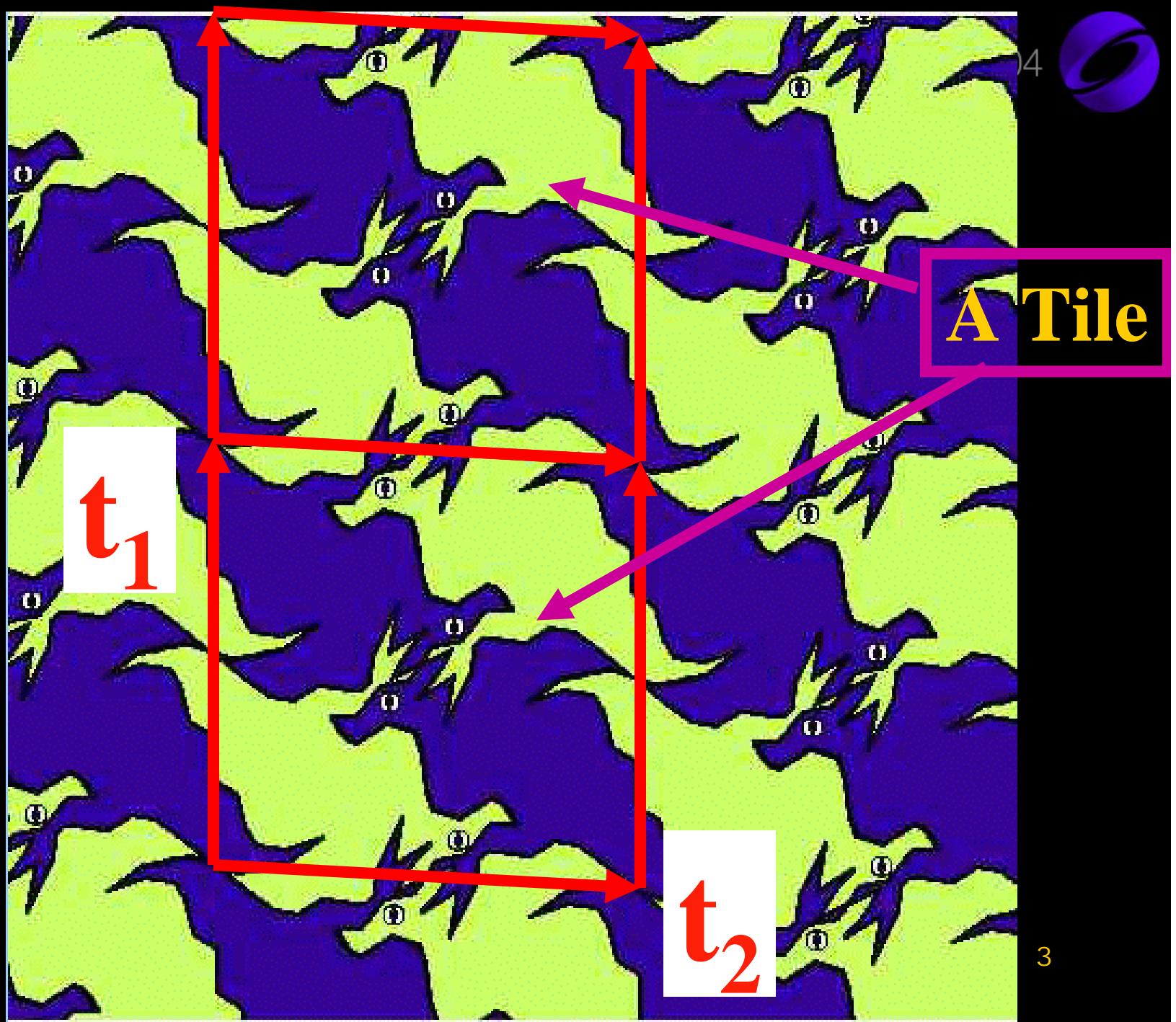


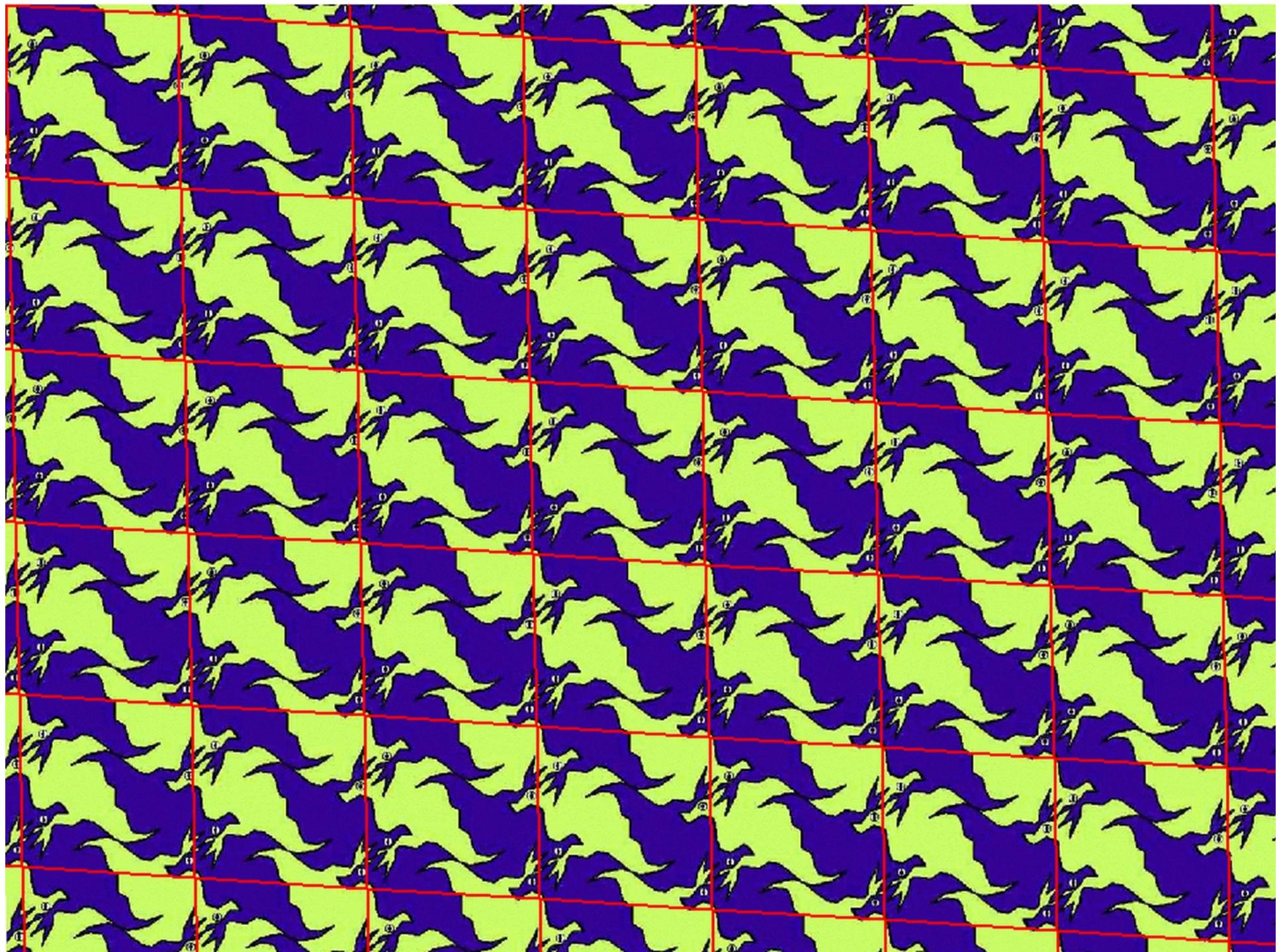
# Near-Regular Textures (NRT) are ubiquitous

SIGGRAPH2004

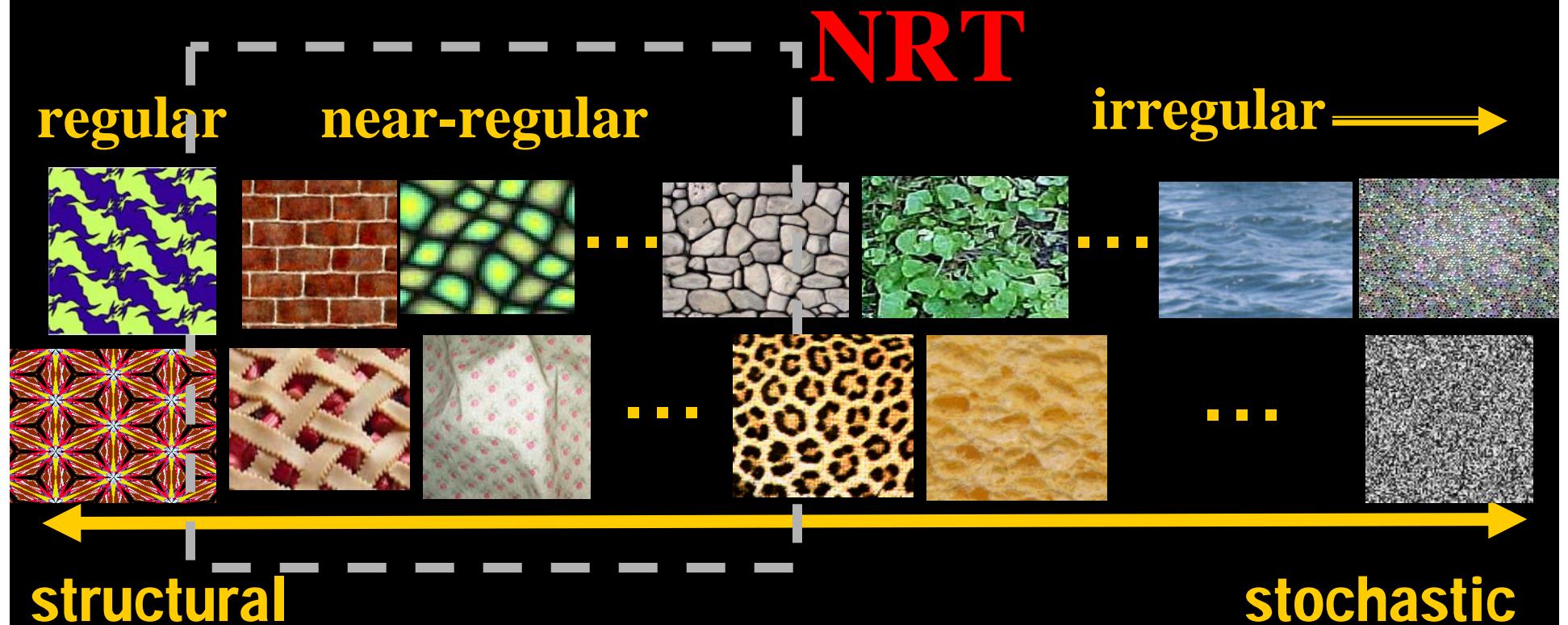


REGULAR  
TEXTURE





# A Texture Spectrum in terms of texture regularity





# A Review

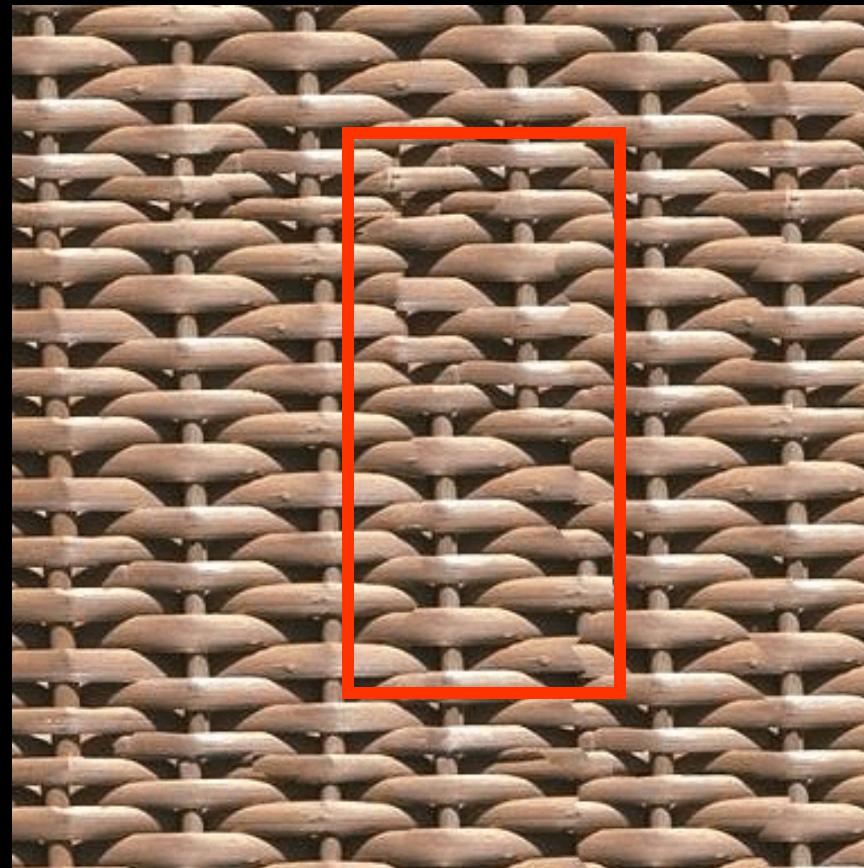
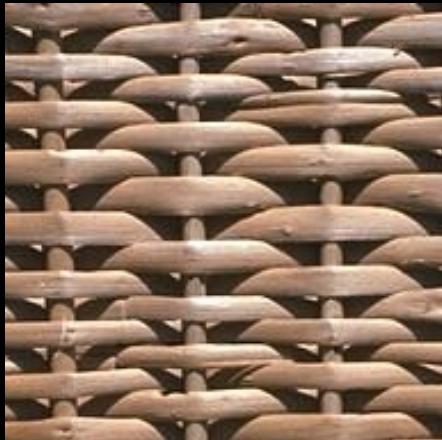
- **Procedural Synthesis**
  - **No input texture is required**  
Perlin (85); Witkin & Kass (91); Turk (91); Dorsey (99) ...
- **Statistical Synthesis**
  - **Construct the statistical model from input textures**  
Cross & Jain (PAMI'83); Heeger & Bergen (95); De Bonet (97);  
Zhu et al. (IJCV'98); Portilla & Simoncelli (IJCV'00) ...
- **Image-based Synthesis**
  - **No explicit model, synthesize by copying and pasting**
  - Efros & Leung (ICCV'99); Wei & Levoy (00); Liang et al  
(TOG 01), Efros & Freeman (01); Kwatra et al. (03); Cohen et  
al. (03)

# Example of NRT synthesis results:



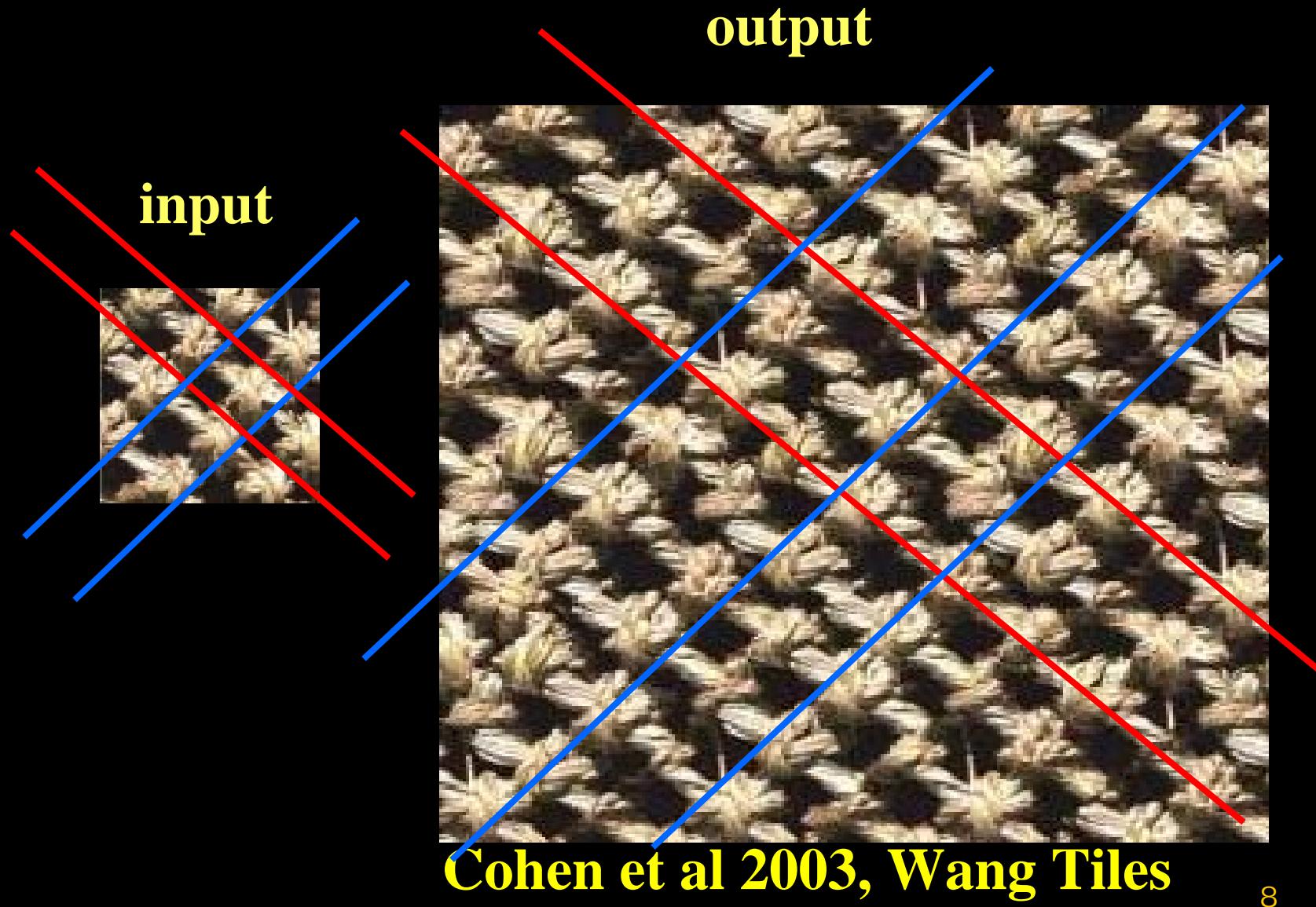
output

input



Efros and Freeman 2001  
Image Quilting

# Example of NRT synthesis results:



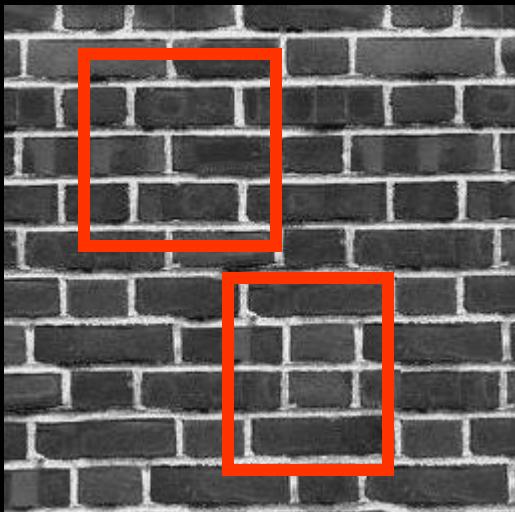
# Example of NRT synthesis results:



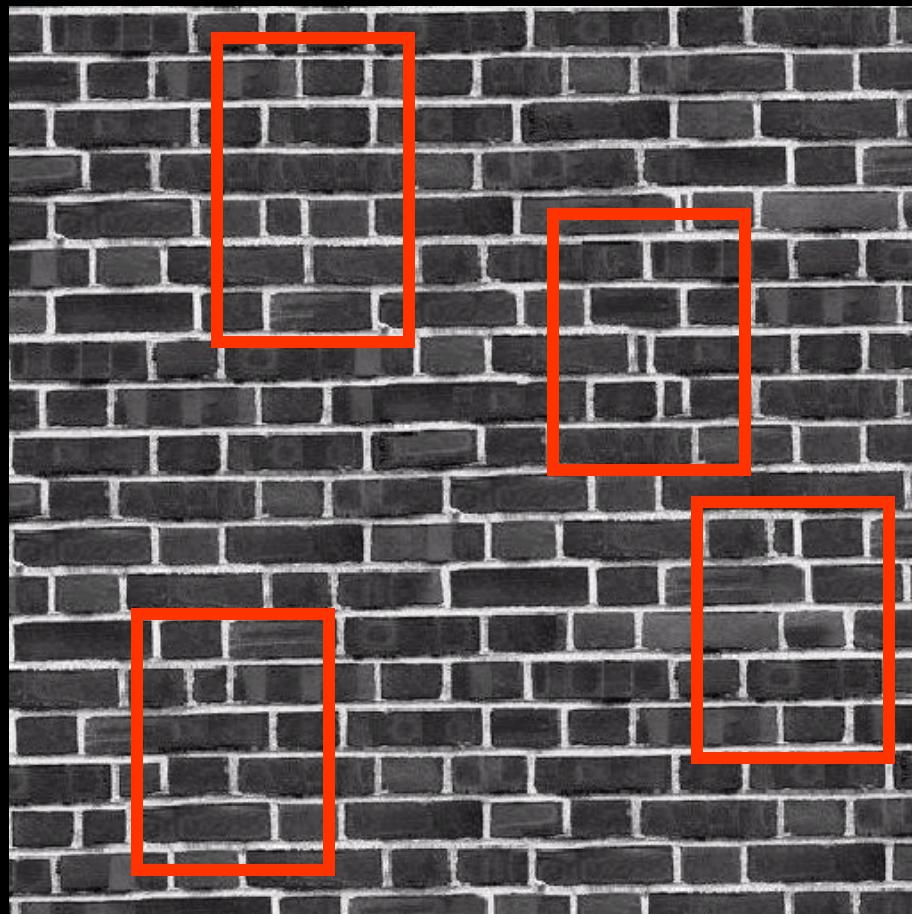
input



output



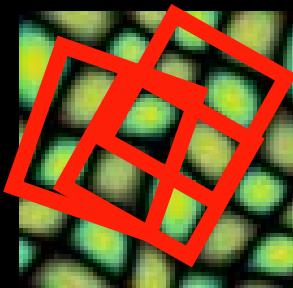
output



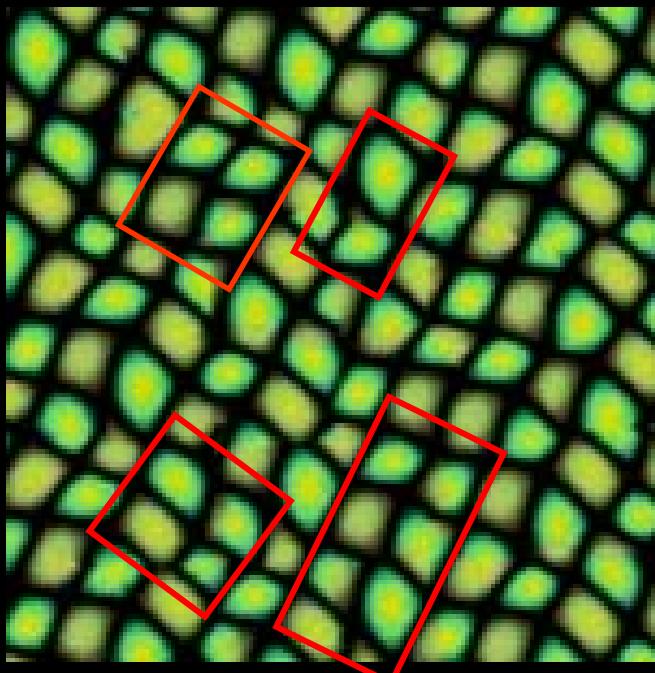
Efros/Freeman (2001)

Special thanks to Kwatra et al  
Graph-cut (2003)

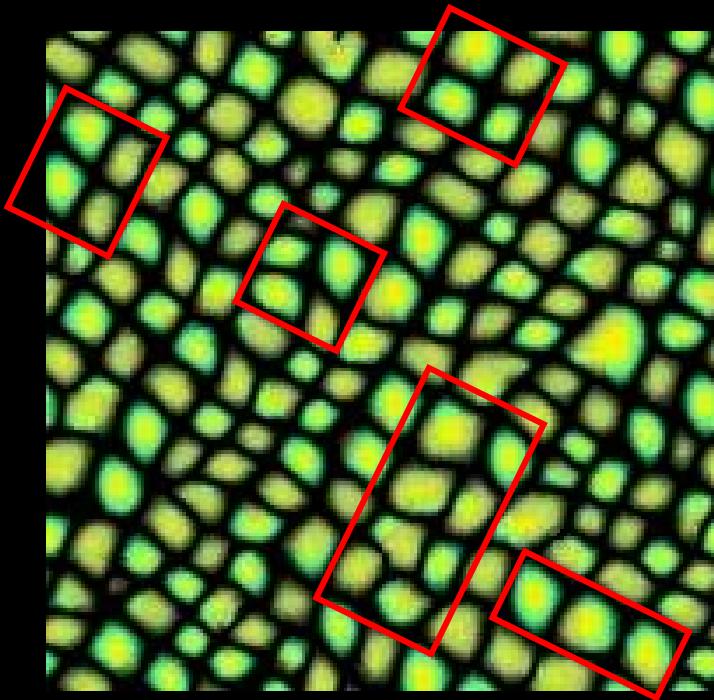
# Example of NRT synthesis results:



Input texture



Efros & Freeman  
SIGGRAPH'01



Wei & Levoy  
SIGGRAPH'00

# Comparison of Near-regular Texture Synthesis Results

SIGGRAPH2004



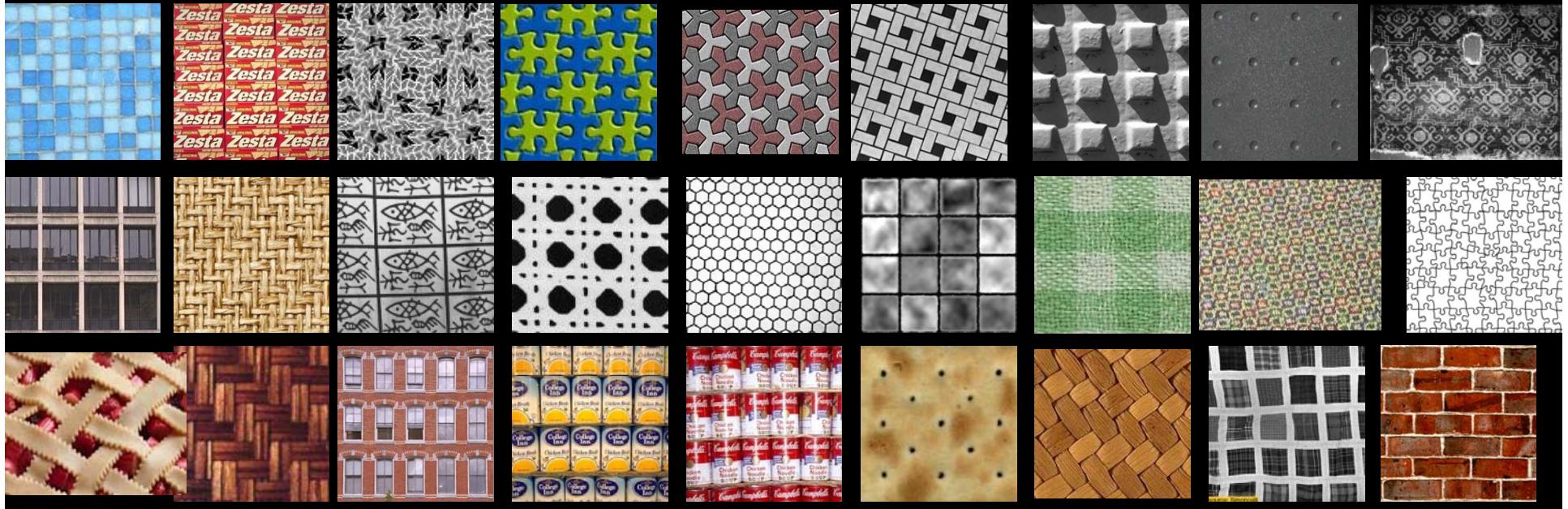
SIGGRAPH'04 poster #16

A Comparison Study of Four Texture Synthesis Algorithms on Regular and Near-regular Textures

*W. Lin, J.H. Hays, C. Wu, V. Kwatra, and Y. Liu*

CMU-RI-TR-04-01, Carnegie Mellon University. January, 2004

General-purpose texture synthesis algorithms tested have less than 60% results preserve regularity faithfully



# Motivations

SIGGRAPH2004



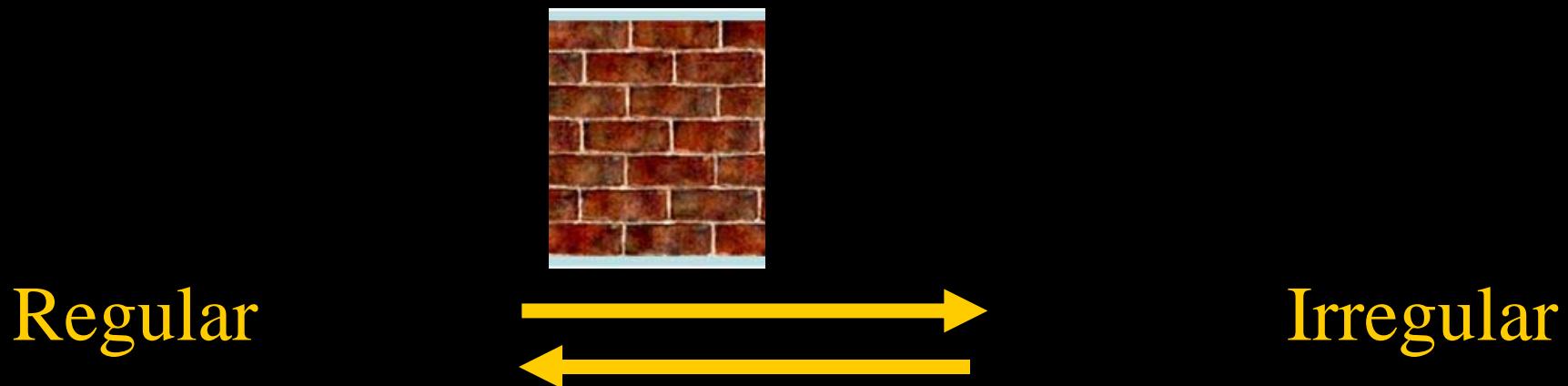
- NRTs are common and important (perception)
- NRTs are special: (regular + random) in one
- NRT analysis complements existing work
- NRT synthesis results can be more objectively evaluated

Near-regular textures are lots of fun!



# Two Key Insights

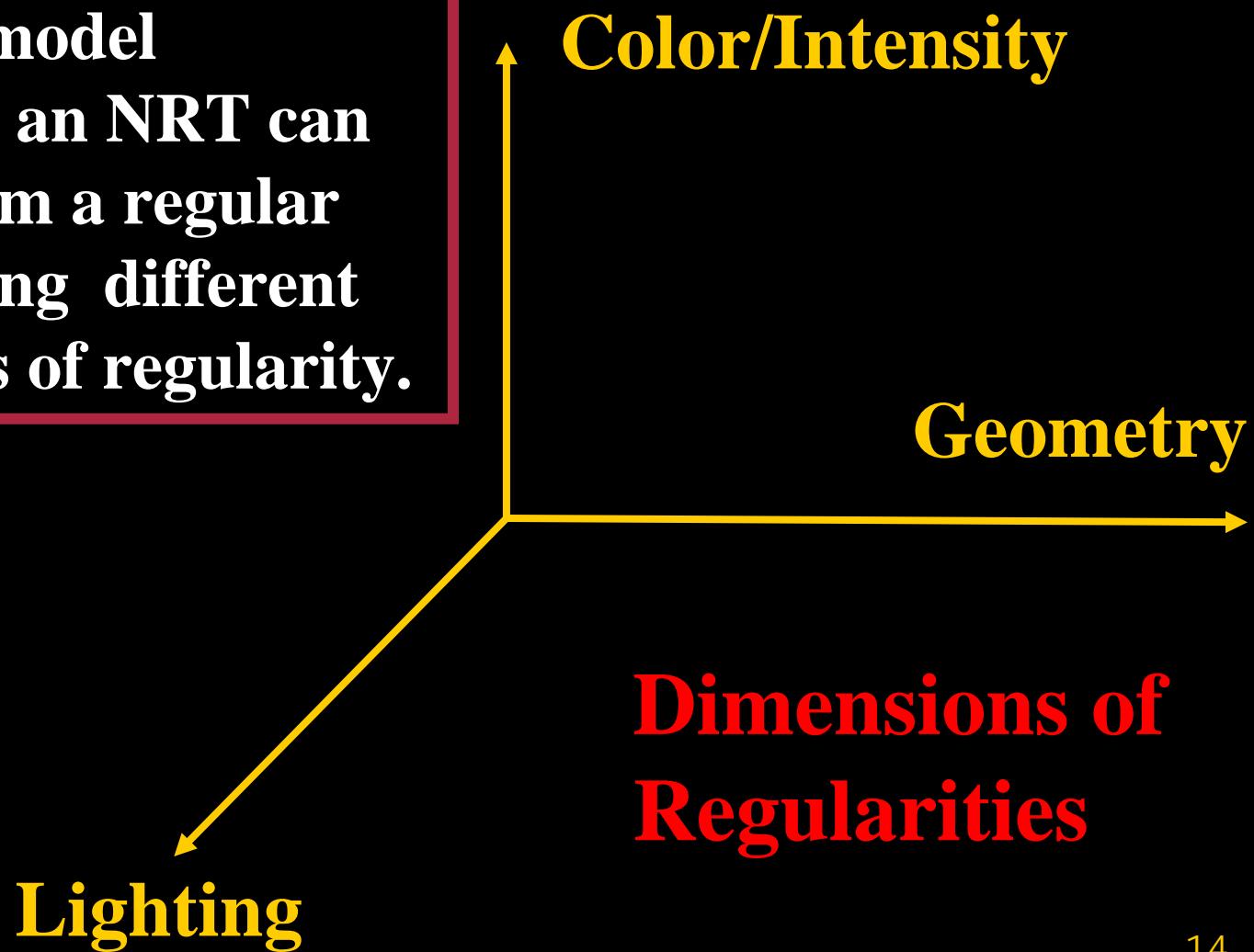
#1: Dynamic nature: A Near-Regular Texture can be viewed as a deformation from some Regular Texture





# Two Key Insights

#2: Multi-model variations: an NRT can deviate from a regular texture along different dimensions of regularity.

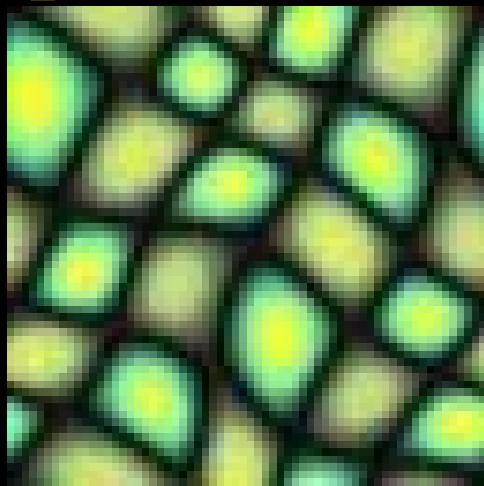


Conceptually,

SIGGRAPH2004

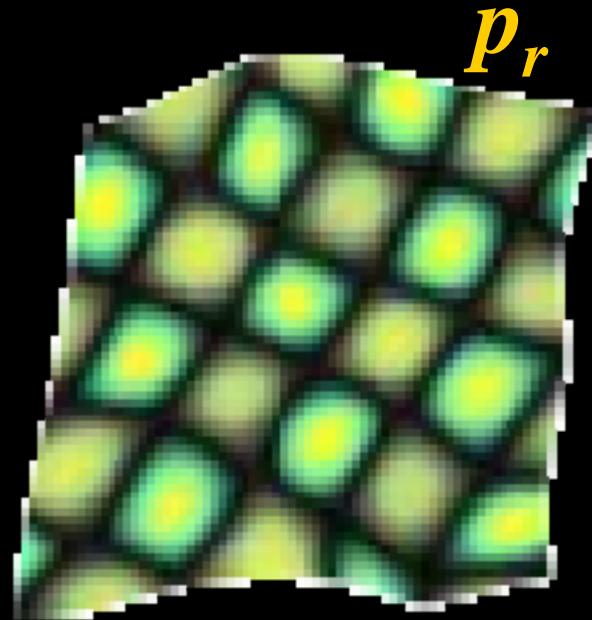


$p$



Near-Regular Texture

$= d($



Regular Texture

$p_r$

where  $d$  is a deformation field and

$$d = d_{geometry} \times d_{lighting} \times d_{color}$$

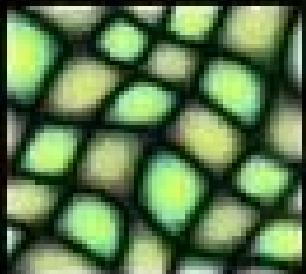


functional composition



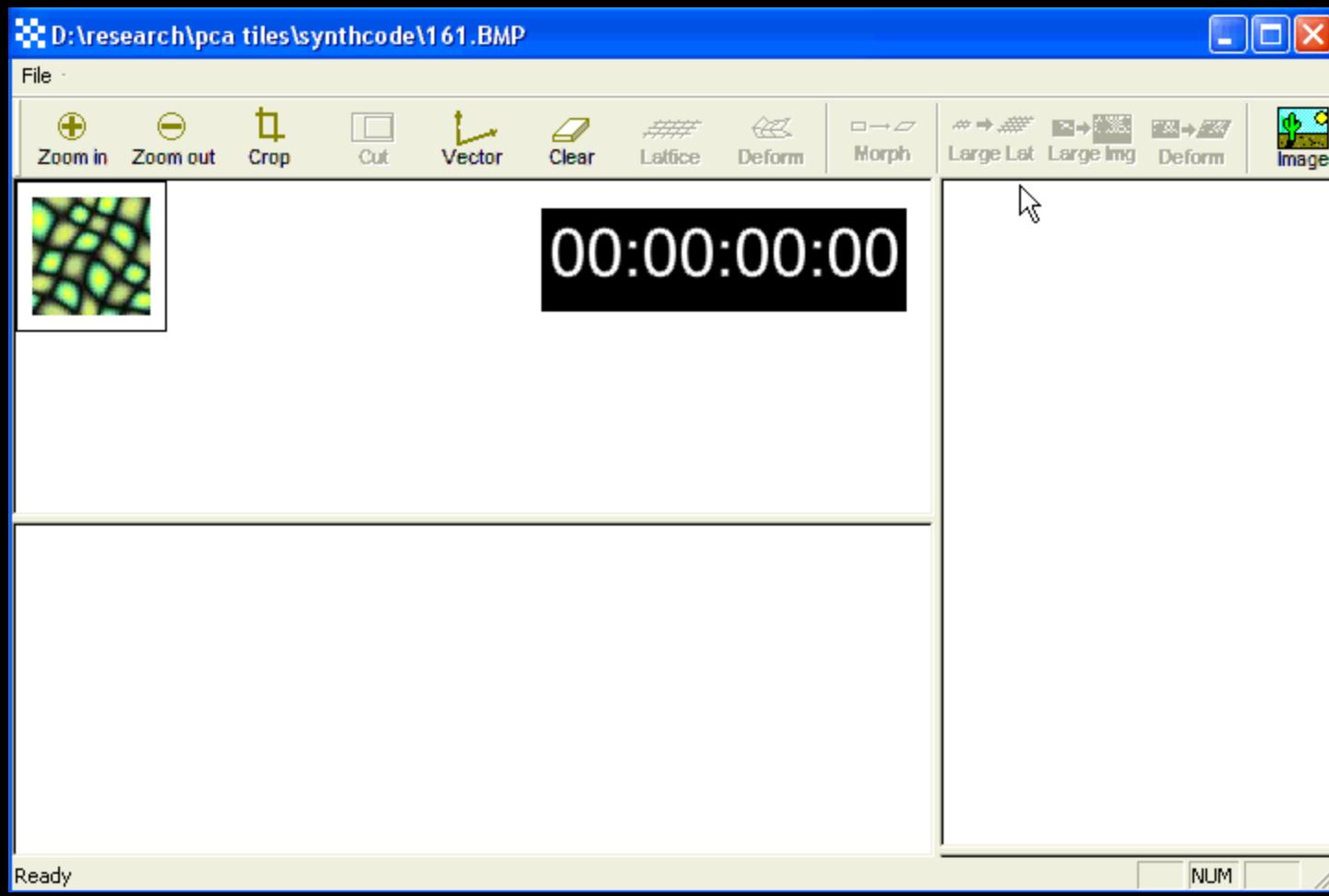
# Geometry Deformation Field

$$d = \boxed{d_{geometry}} \times d_{lighting} \times d_{color}$$



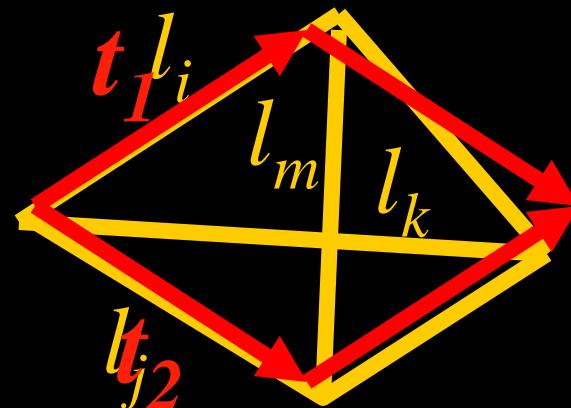
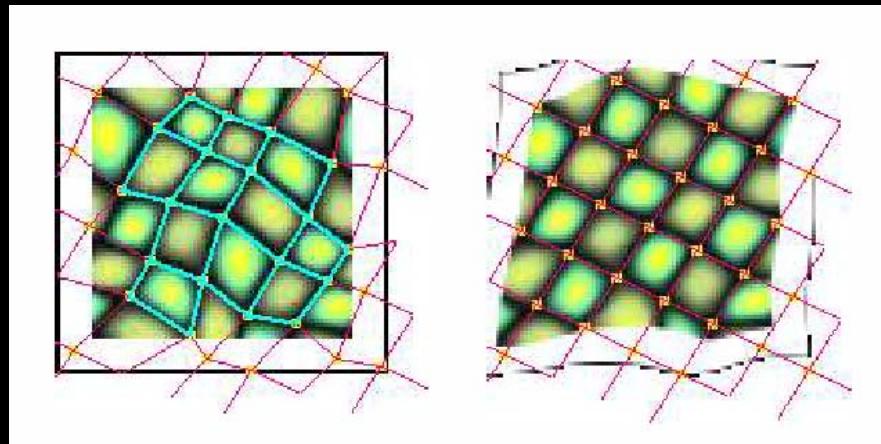


# Interactive Lattice Extraction





# From Irregular to a Regular Lattice



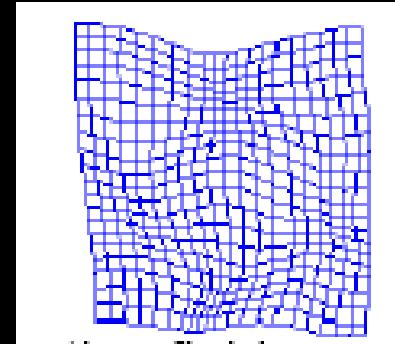
## A spring model for energy minimization

$$\min_{\|\vec{t_1}\|, \|\vec{t_2}\|, \theta} E = \sum_{i=1}^{N_i} (l_i - \|\vec{t_1}\|)^2 + \sum_{j=1}^{N_j} (l_j - \|\vec{t_2}\|)^2 + \sum_{k=1}^{N_k} (l_k - \|\vec{t_1} + \vec{t_2}\|)^2 + \sum_{m=1}^{N_m} (l_m - \|\vec{t_1} - \vec{t_2}\|)^2$$

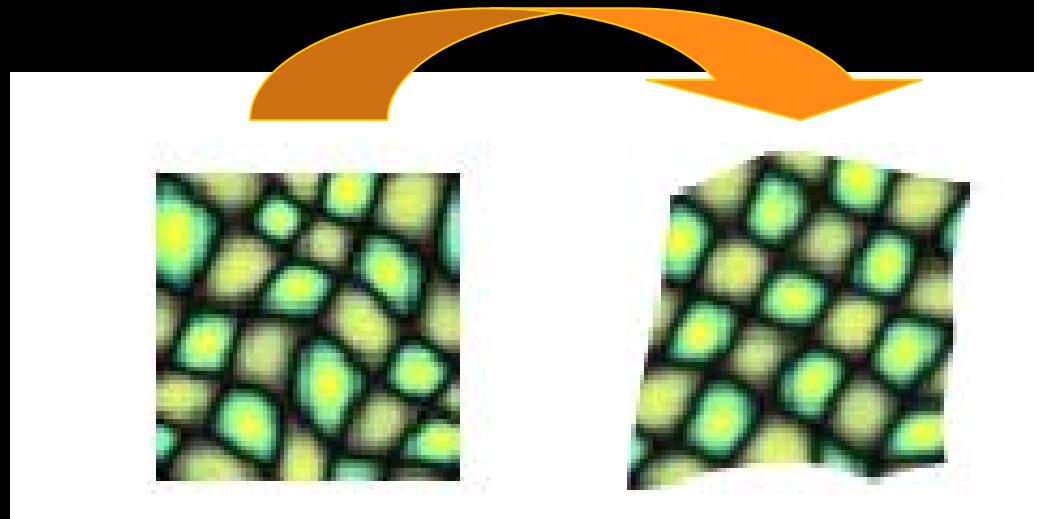
# Geometry Deformation Field Computation



Using lattice points as feature points (control points) to generate a bijective warping function  $d_{geometry}$   
(Multilevel Free-Form Deformation algorithm by Lee *et al* 1995)



$d_{geo}$



Near regular

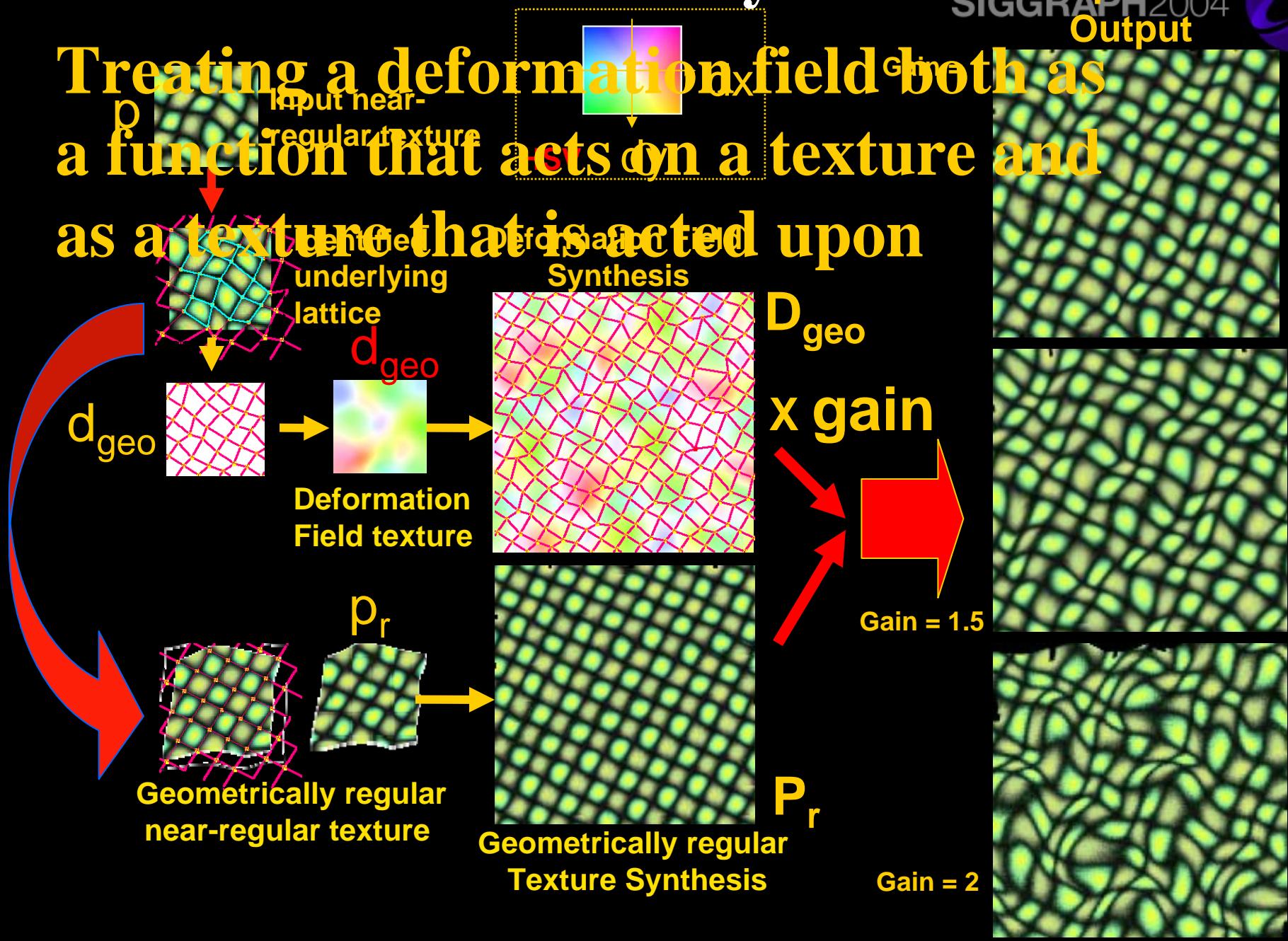
Regular

# Deformation Field Duality

Manipulated  
SIGGRAPH 2004  
Output



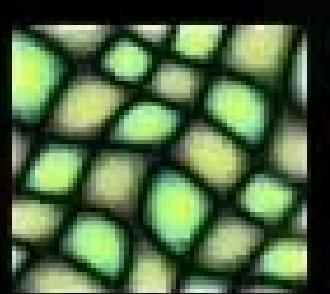
Treating a deformation field both as a function that acts on a texture and as a texture that is acted upon





# Lighting Deformation Field

$$d = d_{geometry} \times d_{lighting} \times d_{color}$$



# Interactive Extraction of Distorted Straightened out lattice Lattice

SIGGRAPH2004





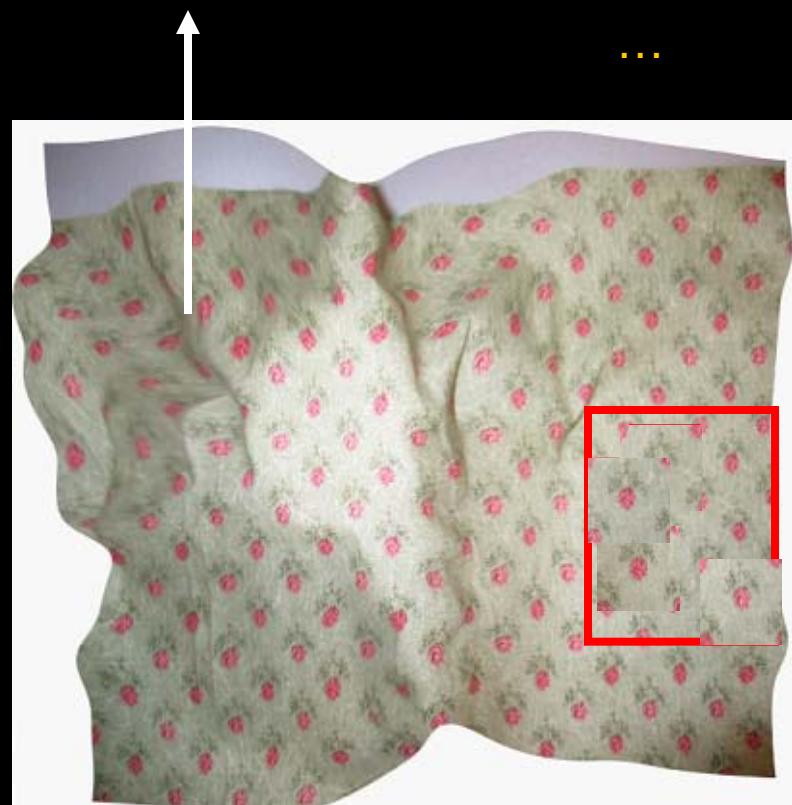
# Lighting Deformation Field Extraction

Tsin, Liu, Ramesh. "Texture replacement in real images," CVPR'01

$p(\text{Segmentation}, \text{Lighting} / \text{Pixels}, \text{Canonical tiles})$



lighting deformation field

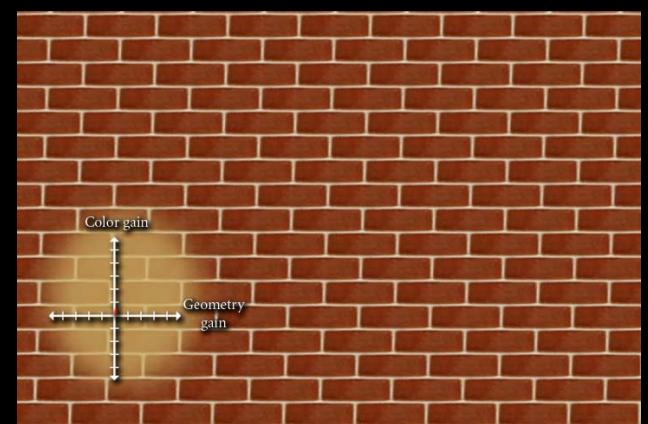
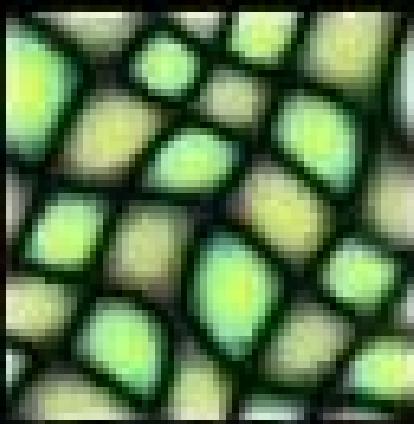


straightened texture



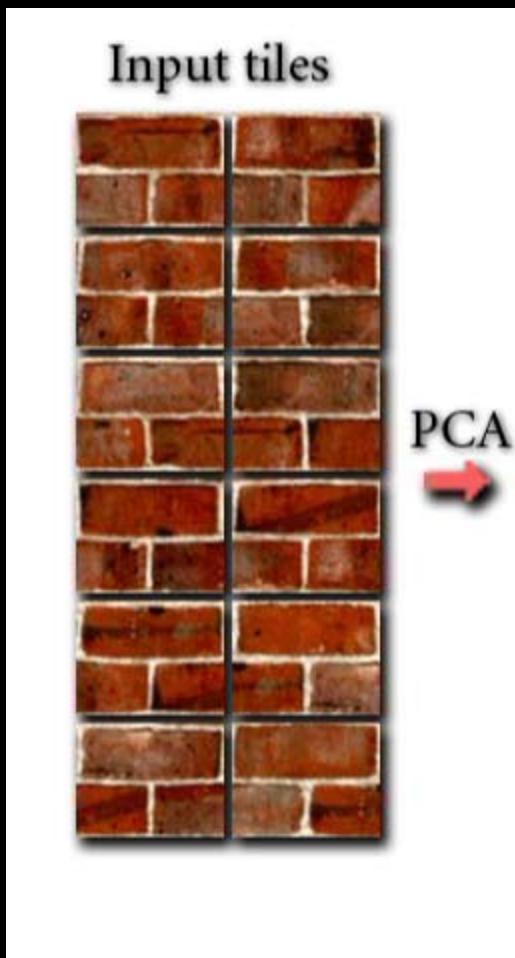
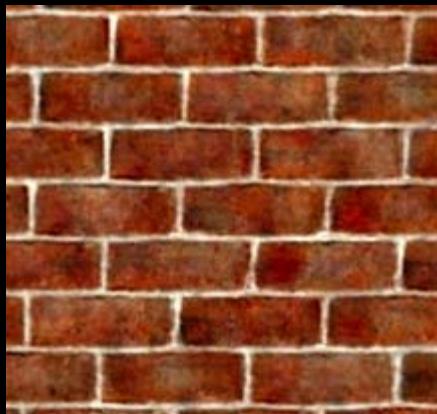
# Color Deformation Field

$$d = d_{geometry} \times d_{lighting} \times d_{color}$$





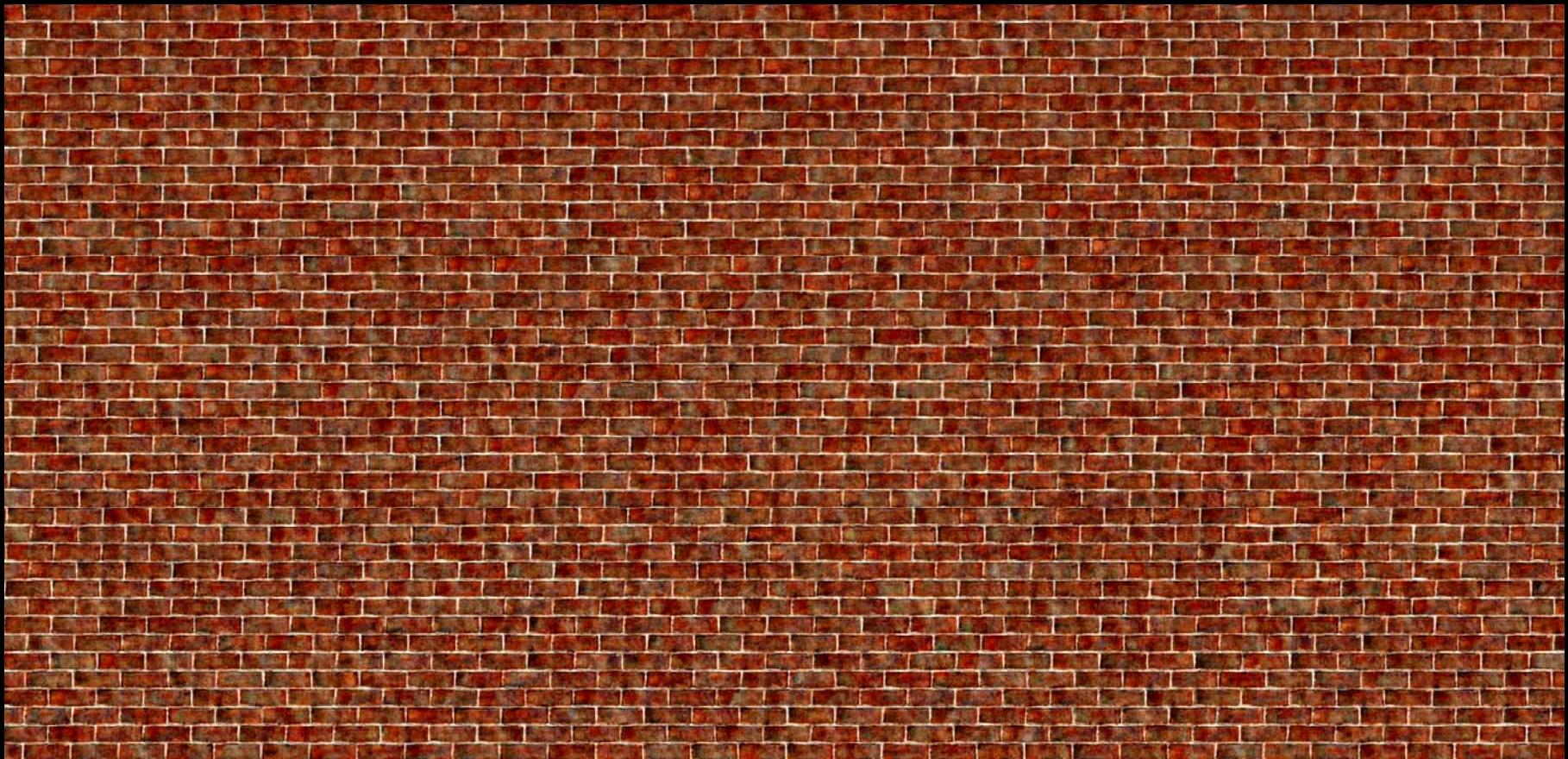
# Principal Component Analysis (PCA)

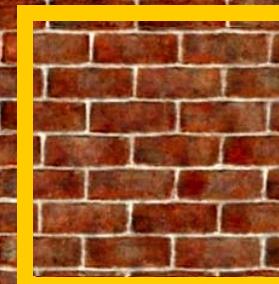


SIGGRAPH2004



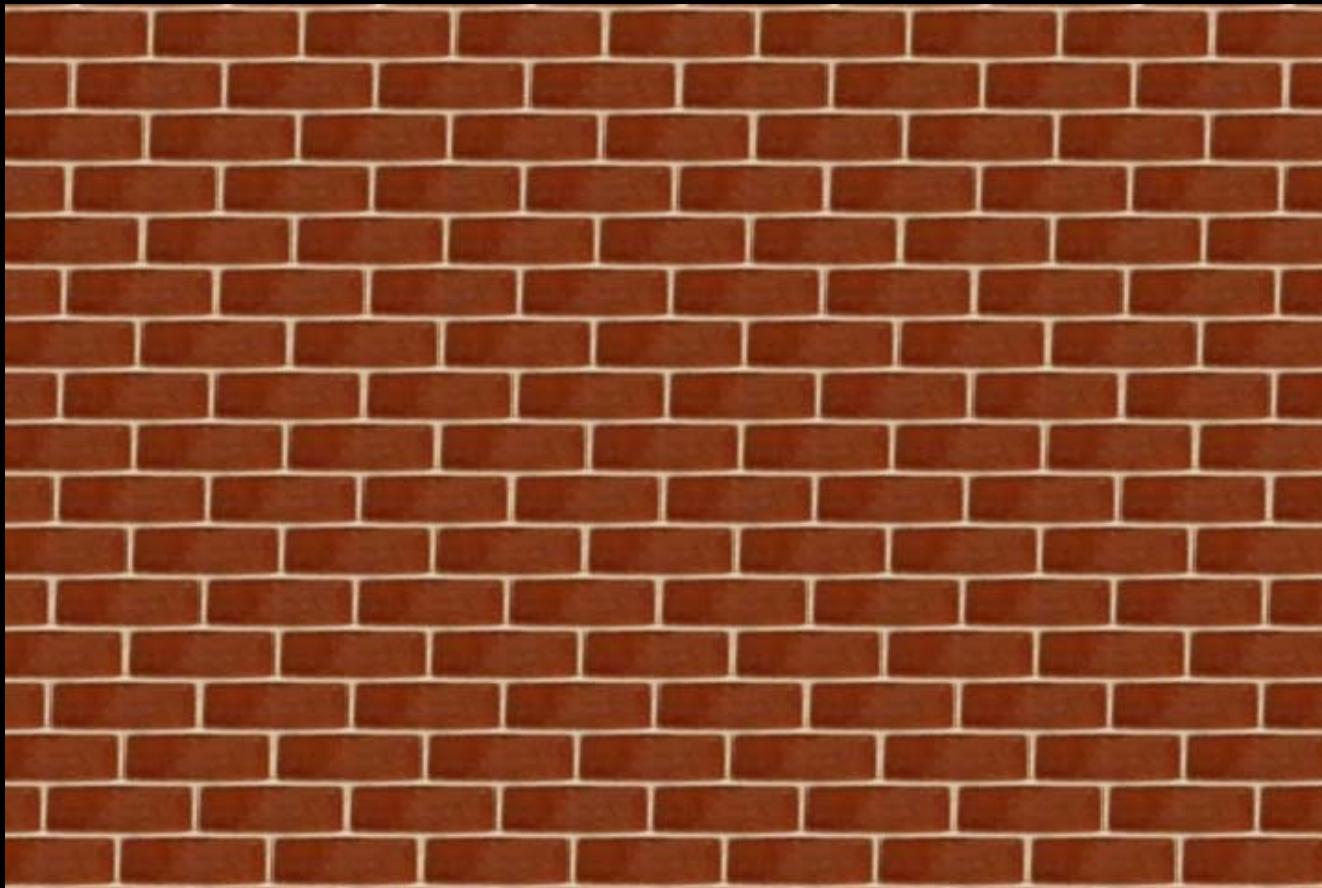
A very large synthesized brickwall  
from 1,400 different tiles!







# Manipulate Geometry and Color Gains



# Geometry and Lighting Deformation Field Pair

SIGGRAPH2004



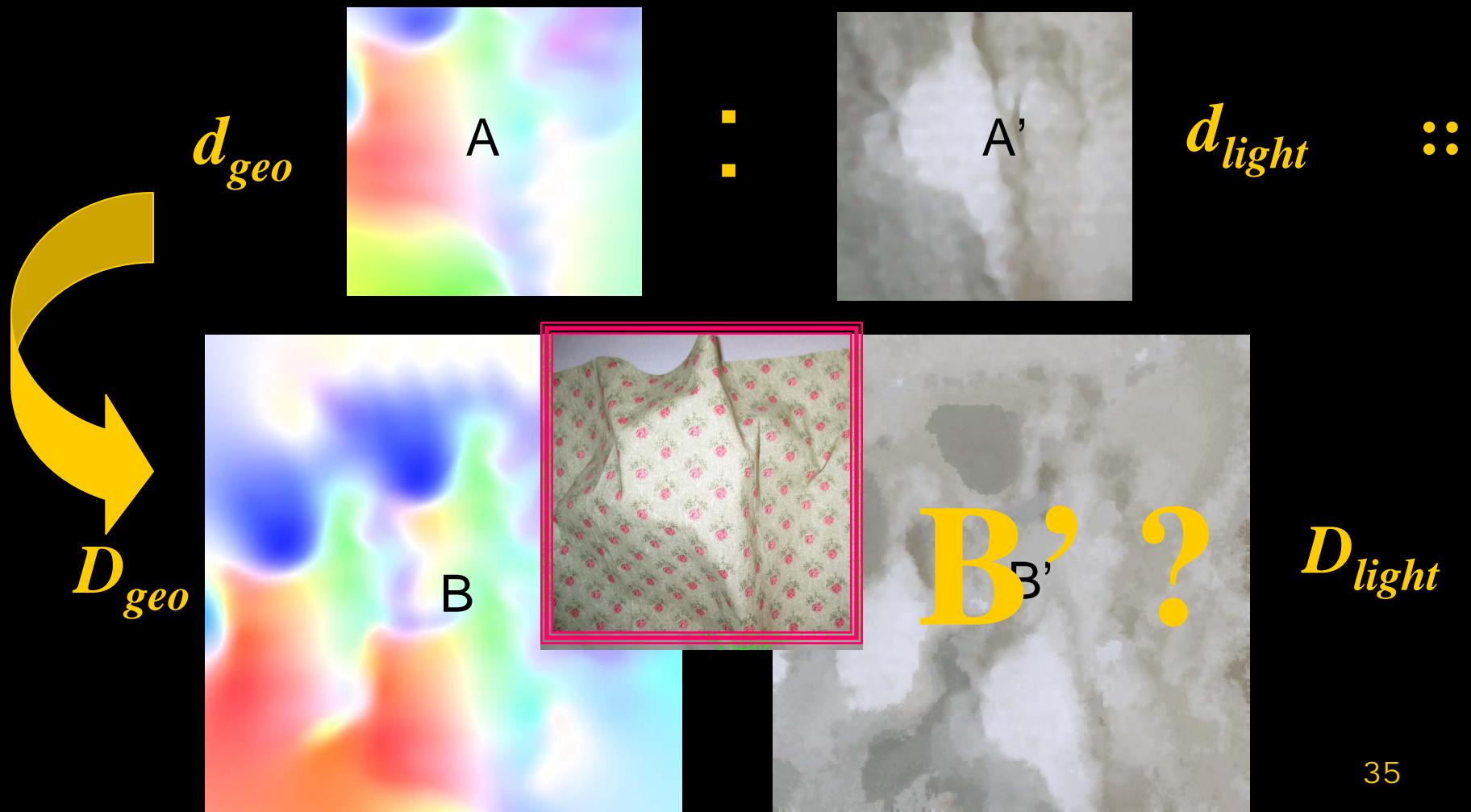
$$d = \boxed{d_{geometry} \times d_{lighting}} \times d_{color}$$

# Texture Synthesis via Deformation Field Analogies

SIGGRAPH2004



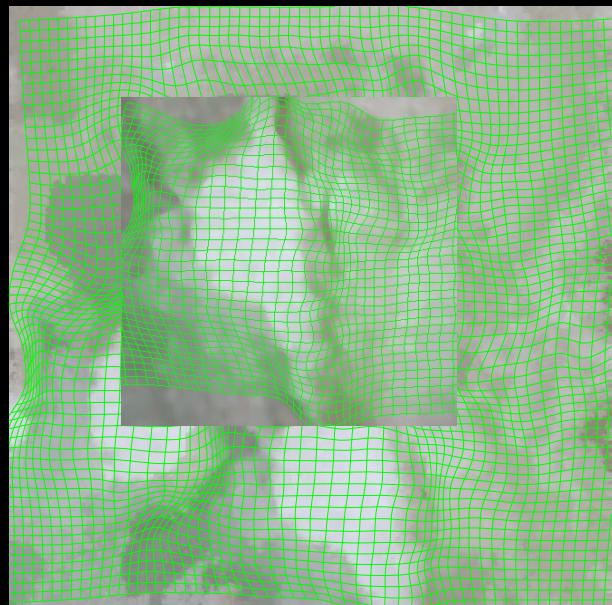
Based on Hertzmann et al. “Image analogies,” SIGGRAPH’01



# Texture Synthesis and Replacement via Deformation Field Analogies

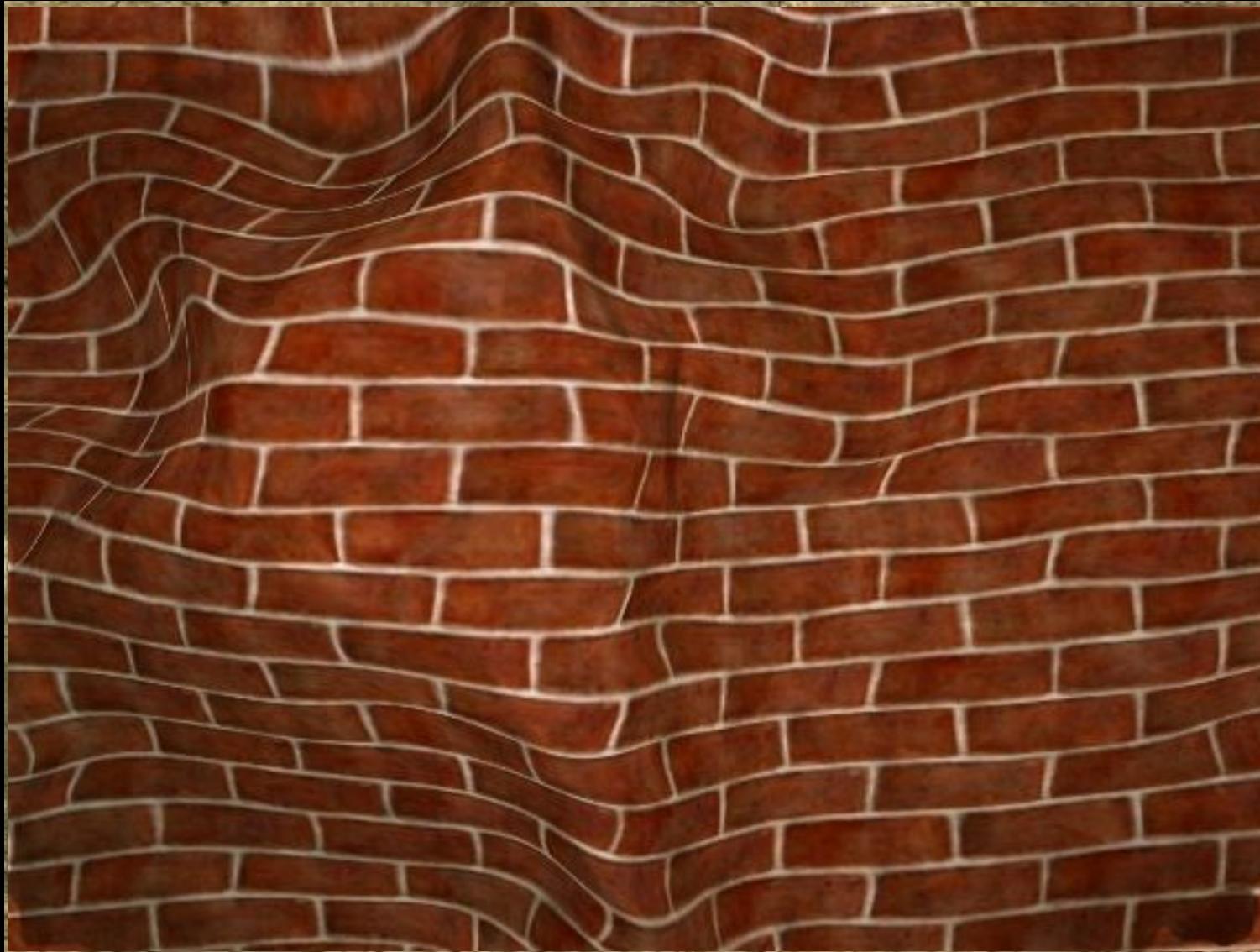


INPUT



# Texture Replacement in Real Photos

SIGGRAPH2004





# Texture Replacement in Real Photos







SIGGRAPH2004



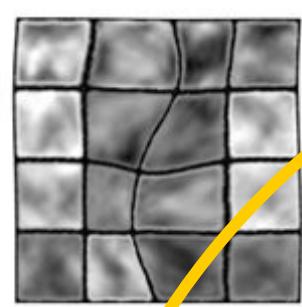
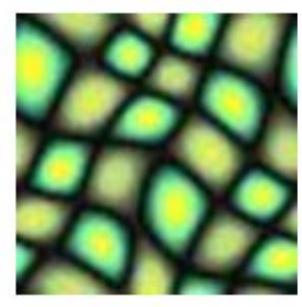
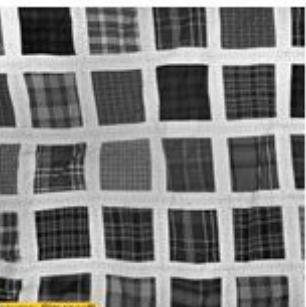
SIGGRAPH2004



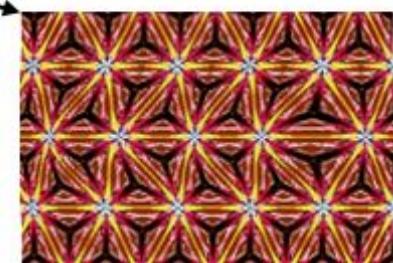
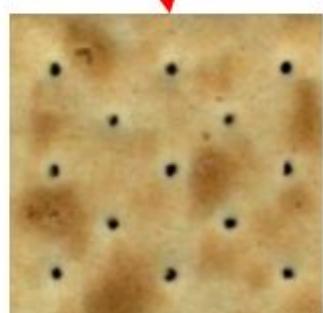
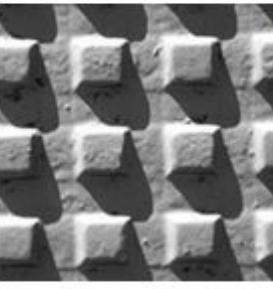
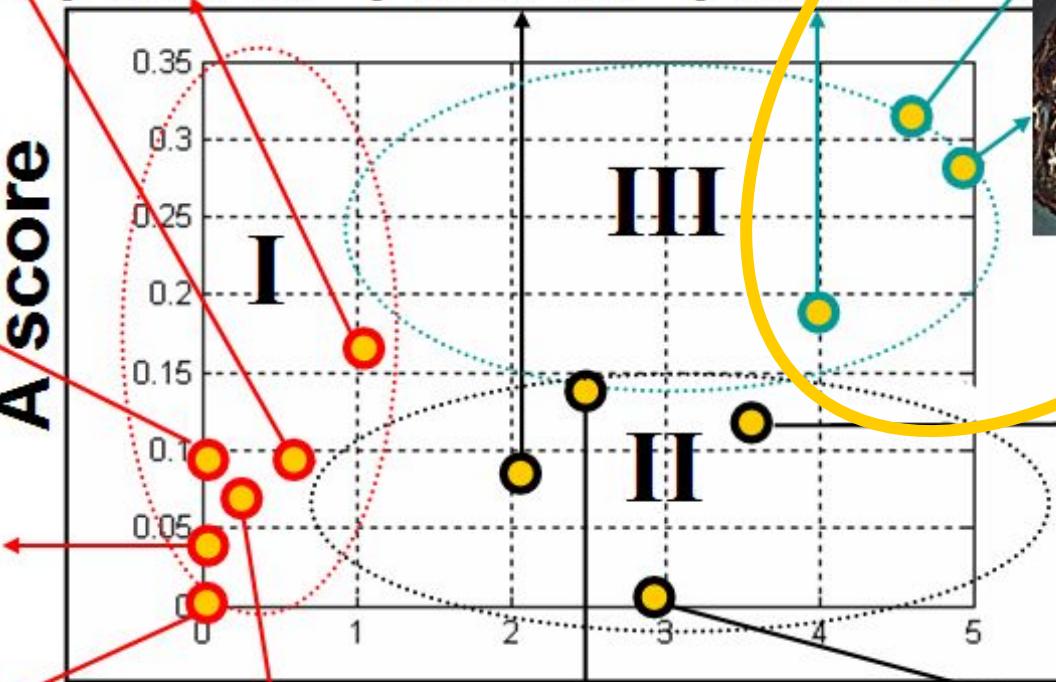


# Evaluation

- Quantification of Near-Regularity
  - Geometry regularity - G Score
  - Appearance regularity - A Score



A score

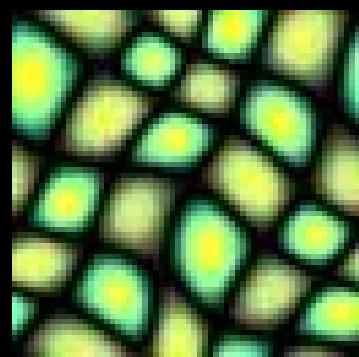


# Texture Synthesis Results Comparison in the Geometry-Appearance Regularity Space

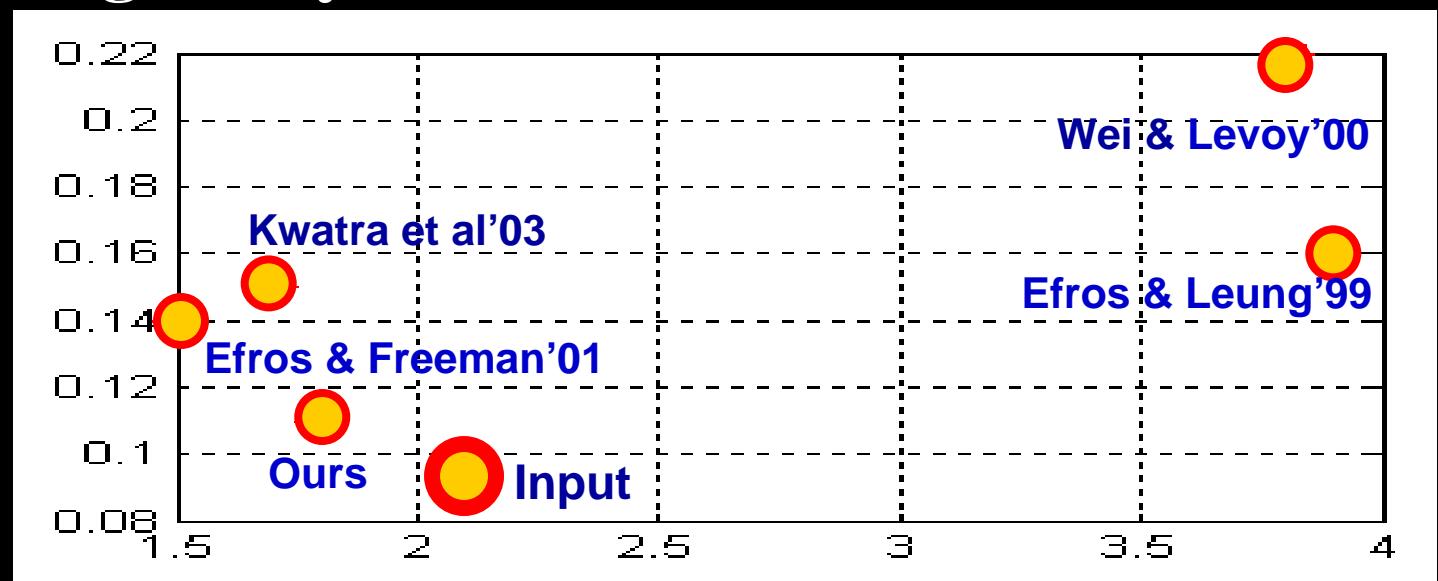
SIGGRAPH2004



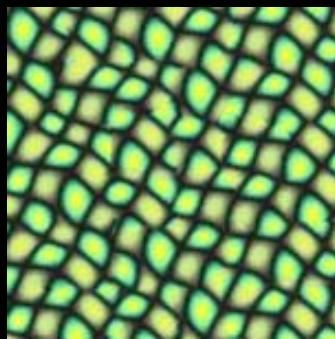
## Appearance Regularity Score



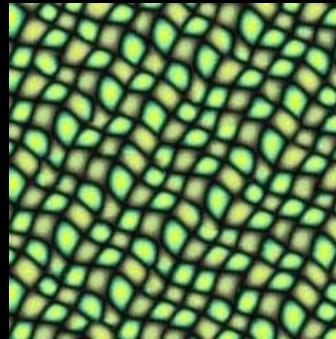
Input Texture  
 $G=2.1, A=0.09$



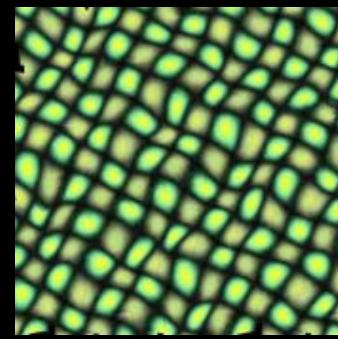
## Geometry Regularity Score



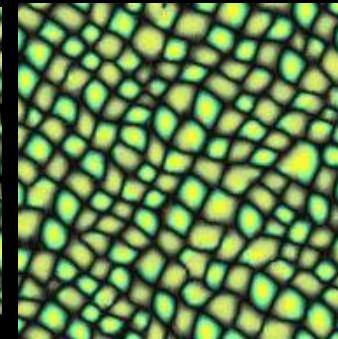
Efros & Freeman'01  
 $G = 1.5, A = 0.14$



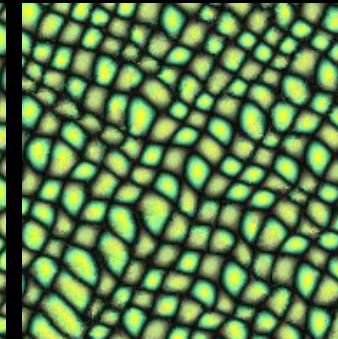
Kwatra et al'03  
 $G = 1.7, A=0.15$



Ours  
 $G = 1.8, A = 0.11$



Wei & Levoy'00  
 $G = 3.8, A= 0.22$



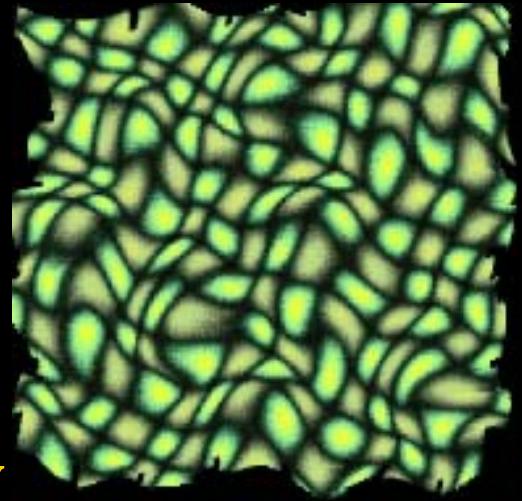
Efros & Leung'99  
 $G = 3.9, A = 0.16$

# Evaluation (cont.)

- **User intervention**
  - Lattice extraction (10 users)
  - Canonical region selection
  - Deformation gain control

# Contributions

- Conceptually,
  - $p = d(p_r)$
  - Deformation Field Duality
- Applications:
  - Faithful near-regular texture synthesis on arbitrarily large surfaces
  - Realistic geometry/lighting deformation field synthesis
  - Manipulation of regularities on output textures
  - Texture replacement in real photos/videos



texture



Geometric  
Deformation  
field



# Limitations

- User interface is a bottleneck
- Occlusion is not explicitly handled
- PCA method is tile-pattern-dependent  
(registration sensitive)
- No 3D surface information is recovered
- Cast shadows pose difficult for realistic synthesis
- ...



# Acknowledgement

- **Yanghai Tsin**
- **Chenyu Wu**
- **Vivek Kwatra**
- **Greg Turk**
- **CMU and GaTech Graphics Labs**
- **NSF IIS-0099597**