

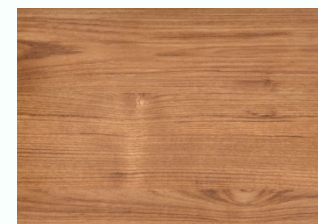
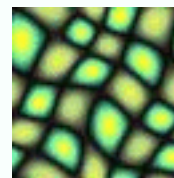
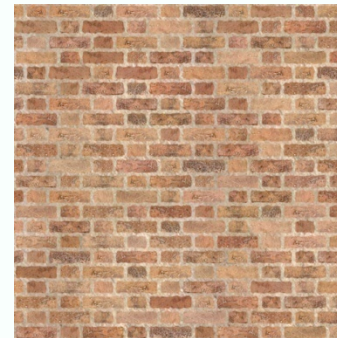
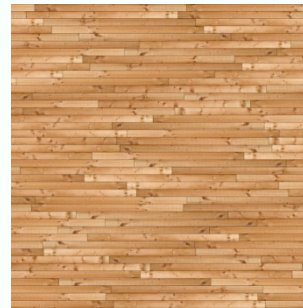
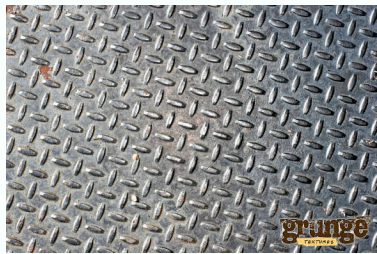
Texture

CS 419

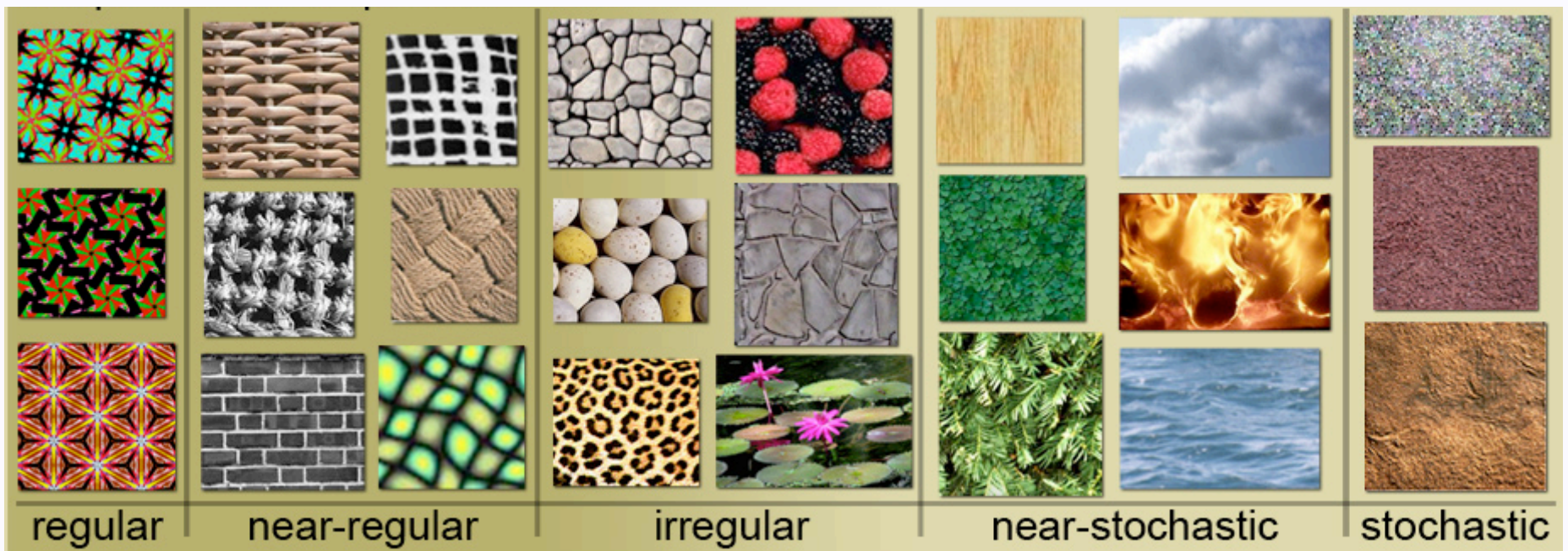
Slides by Ali Farhadi



What is a Texture?



Texture Spectrum



Texture scandals!!



Bush campaign digitally altered TV ad

President Bush's campaign acknowledged Thursday that it had digitally altered a photo that appeared in a national cable television commercial. In the photo, a handful of soldiers were multiplied many times.

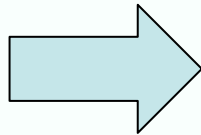
This section shows a sampling of the duplication of soldiers.



Two crucial algorithmic points

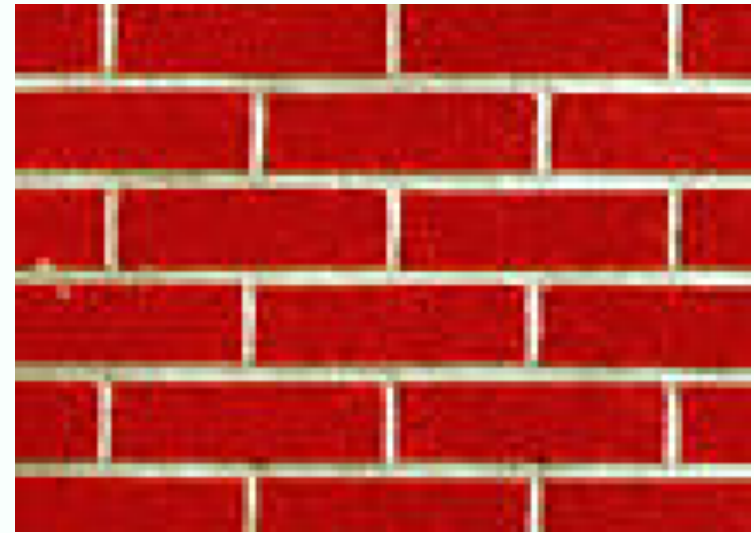
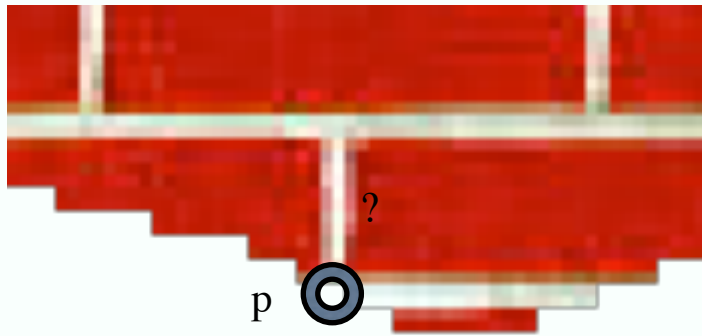
- Nearest neighbors
 - again and again and again
- Dynamic programming
 - likely new; we'll use this again, too

Texture Synthesis



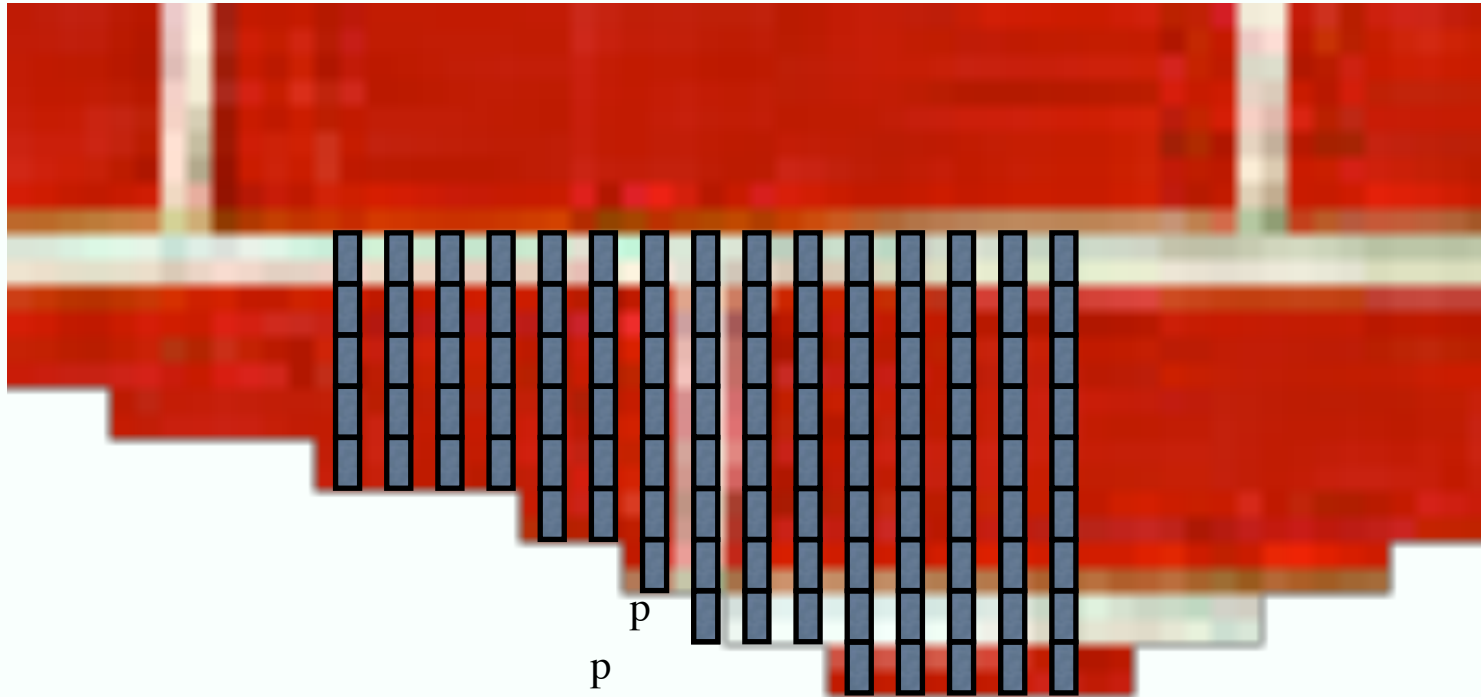
Efros & Leung ICCV99

How to paint this pixel?

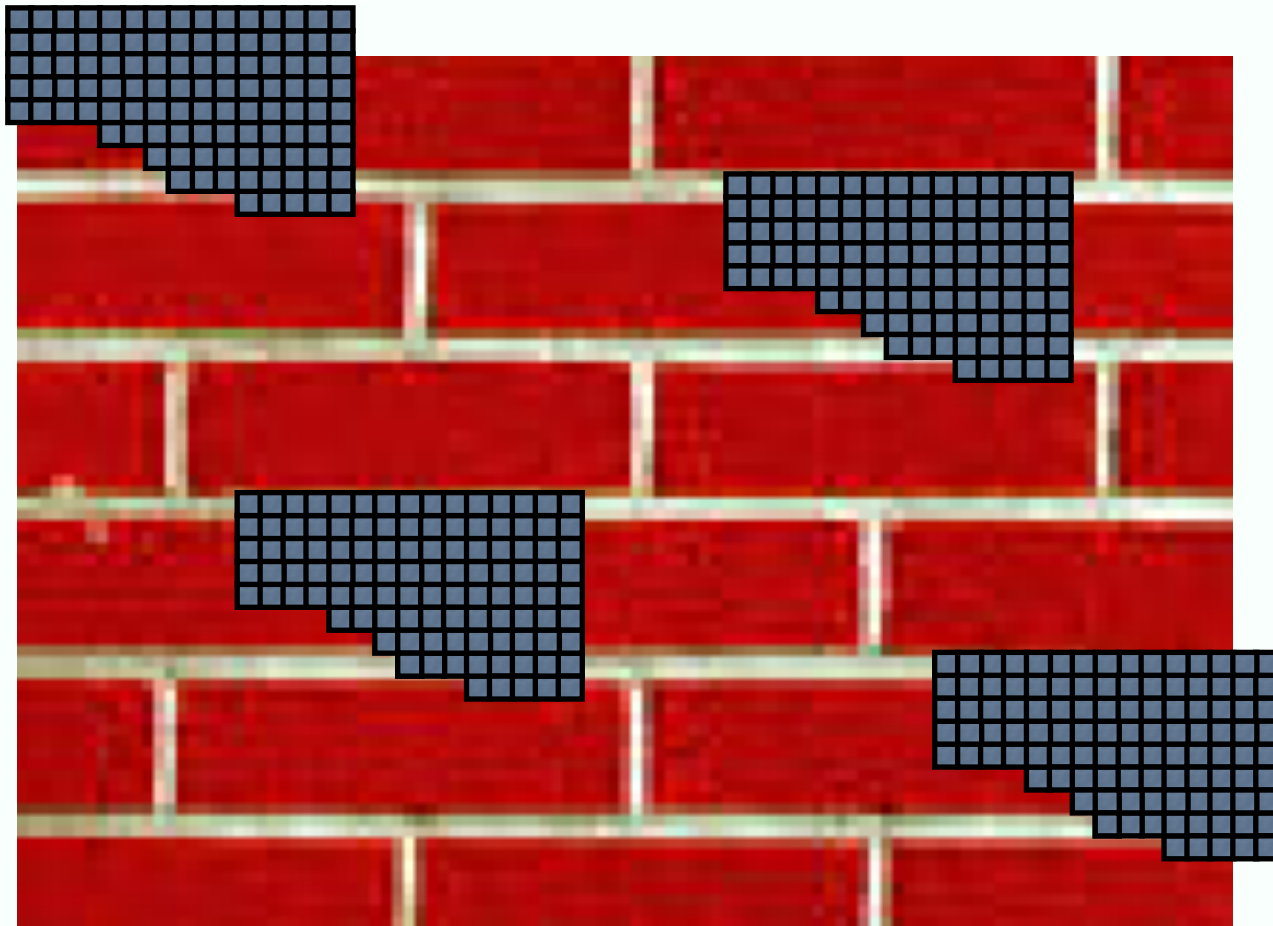


Input texture

Ask Neighbors



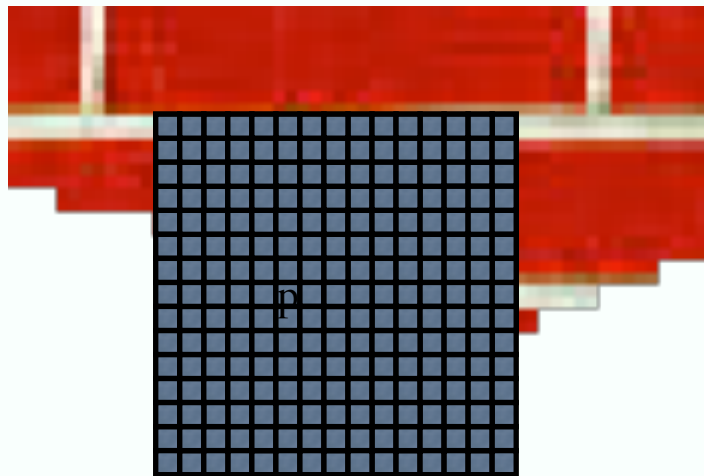
- What is the conditional probability distribution of p , given it's neighbors?



Input image

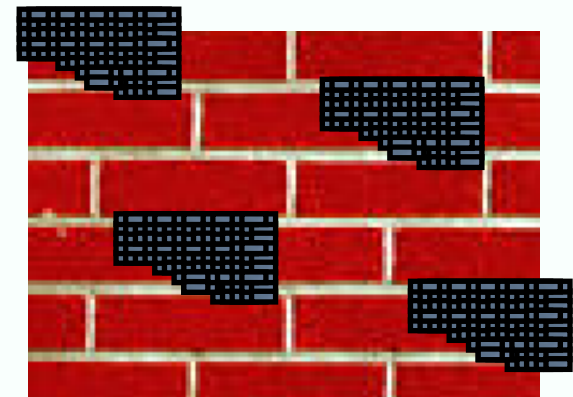
- Don't bother to model the distribution
 - It's already there, in the image

Efros & Leung Algorithm



Synthesizing a pixel

non-parametric
sampling



Input image

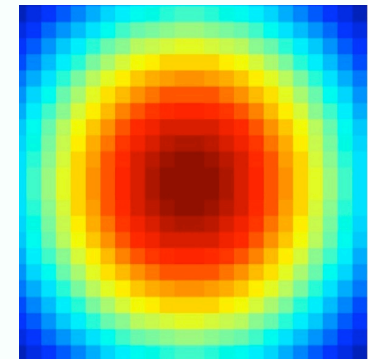
Concerns

- Distance metric
- Neighborhood size
- Order to paint

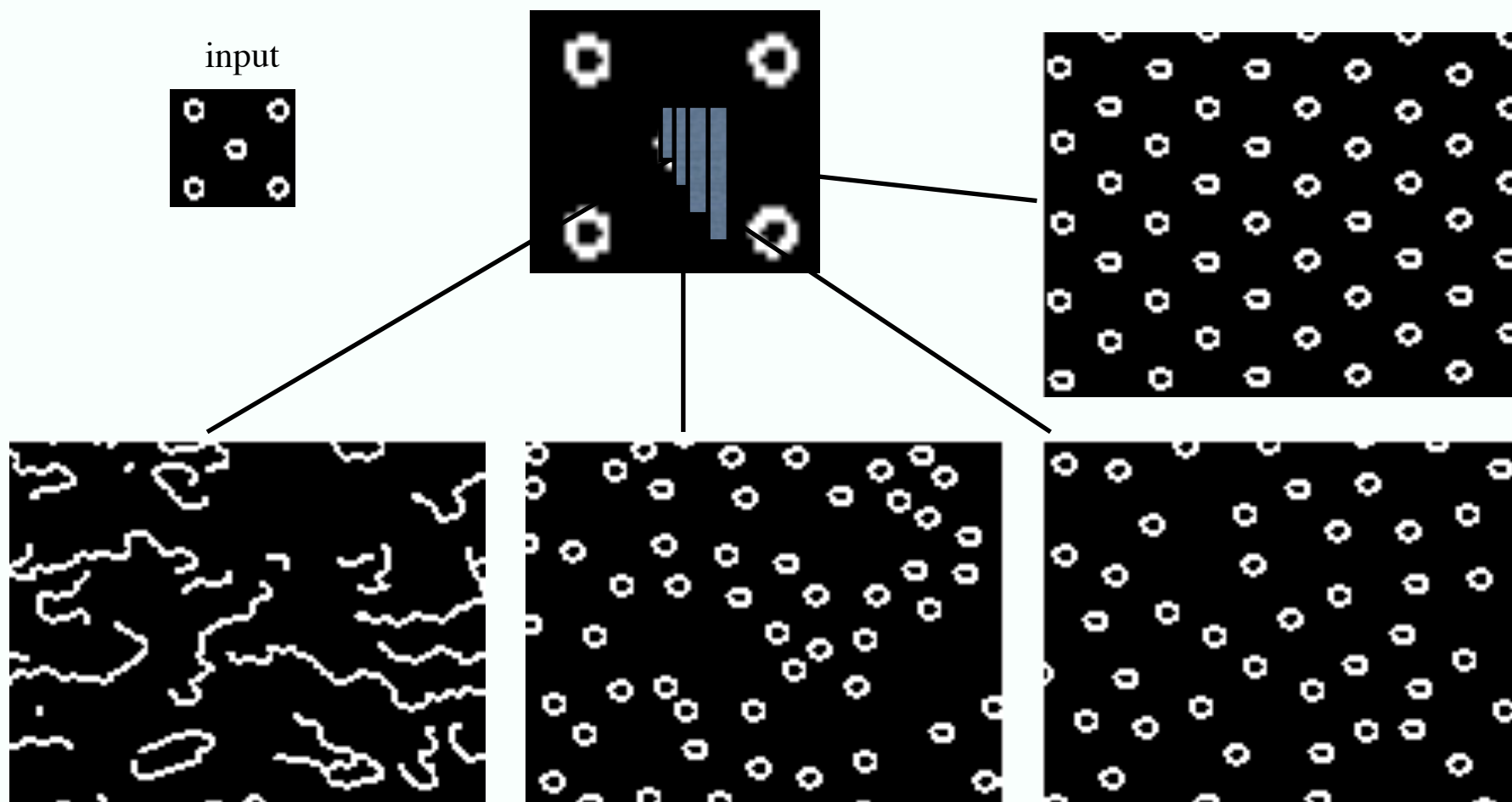
Distance metric

- Normalized sum of squared distances
- Not all the neighbors worth the same
 - Gaussian mask

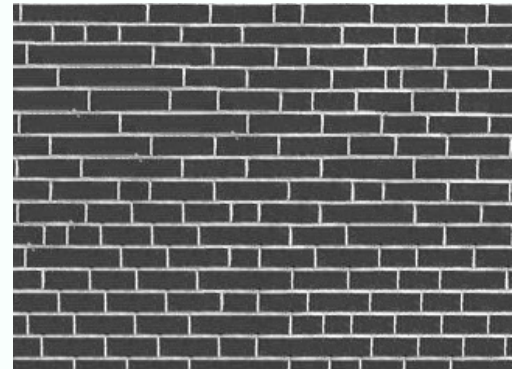
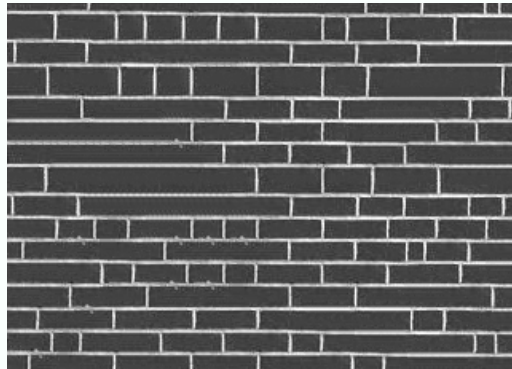
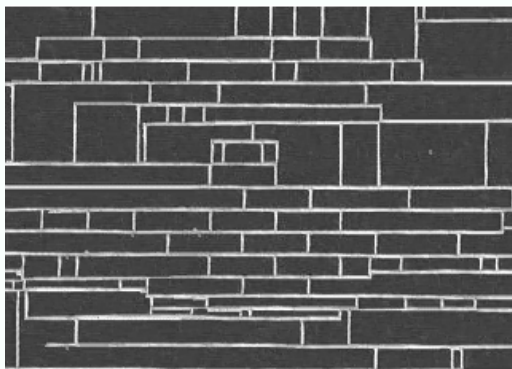
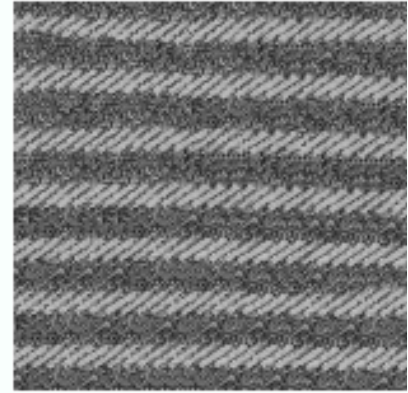
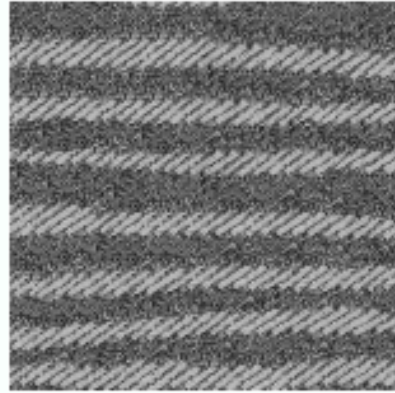
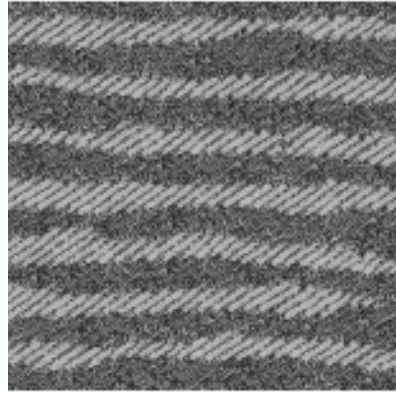
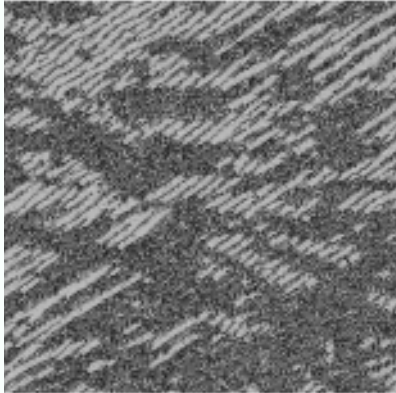
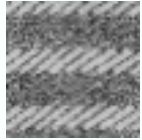
- Preserve the local structure
- Pick among reasonably similar neighborhoods



Neighborhood size

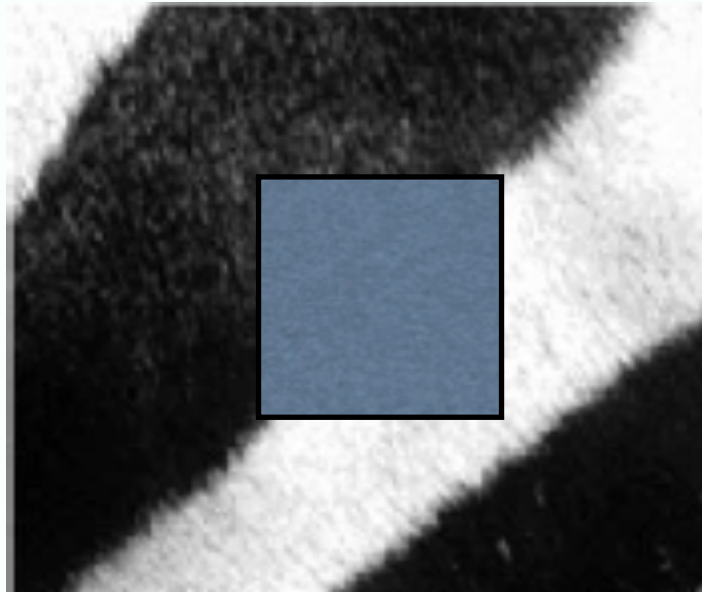


Varying Window Size

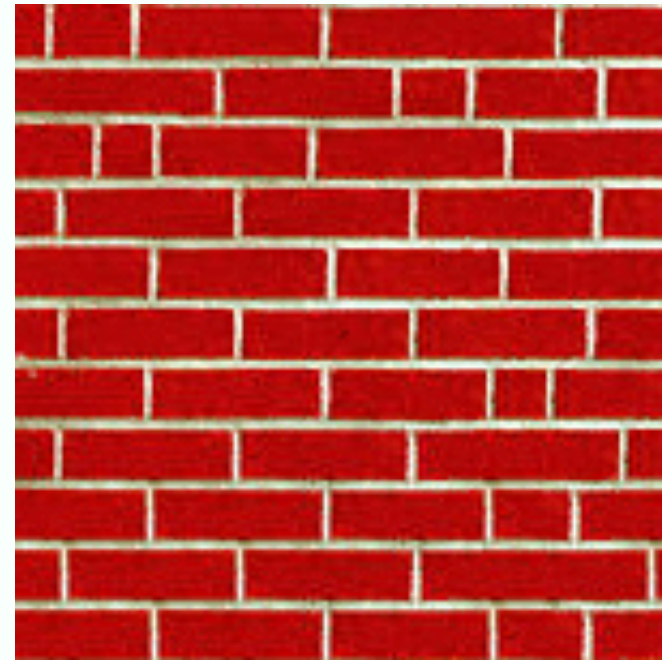
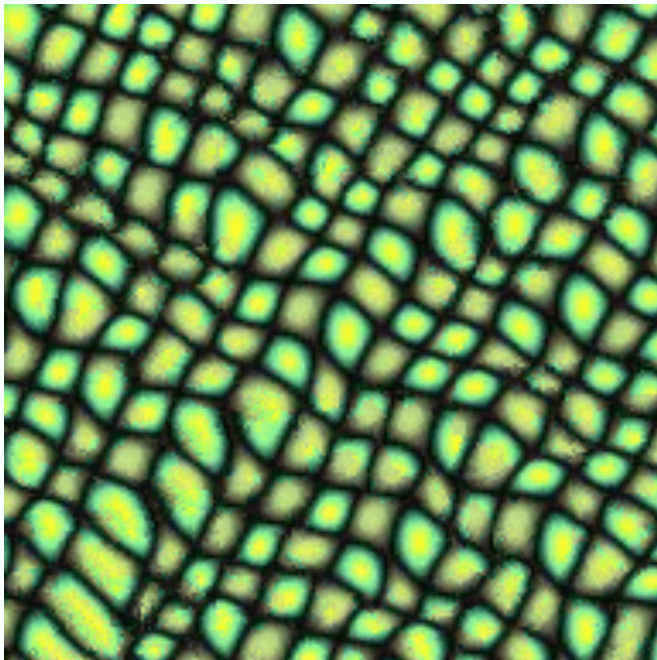
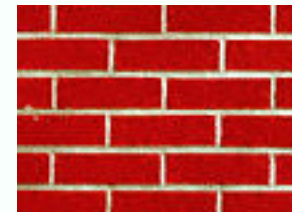
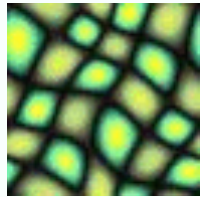


Increasing window size

The Order matters

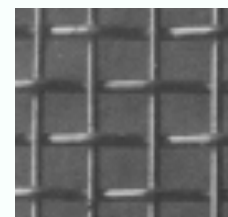


Some Results

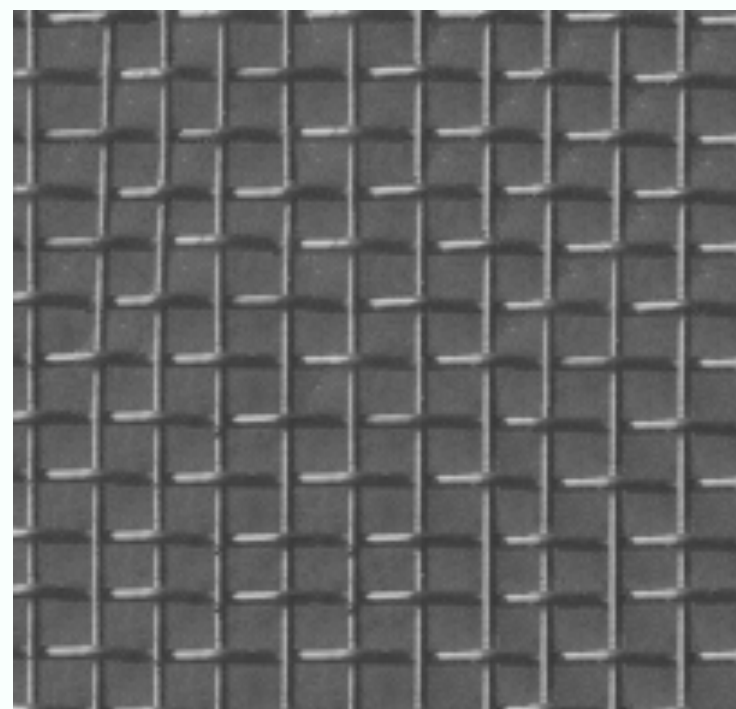


More Results

ut it becomes harder to lau
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scribed it last fall. He fai
ut he left a ringing questi
ore years of Monica Lewin
inda Tripp?" That now see
Political comedian Al Fra
xt phase of the story will

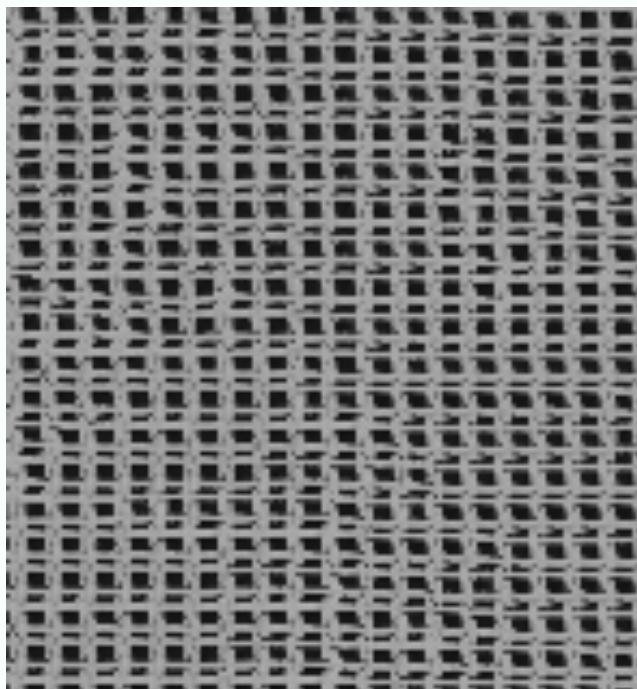
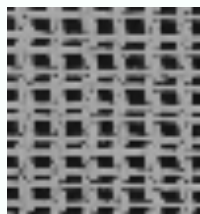


ut it becomes harder to lau
ound itself, at "this daily
wing rooms," as House Der
scribed it last fall. He fai
ut he left a ringing questi
ore years of Monica Lewin
inda Tripp?" That now see
Political comedian Al Fra
xt phase of the story will

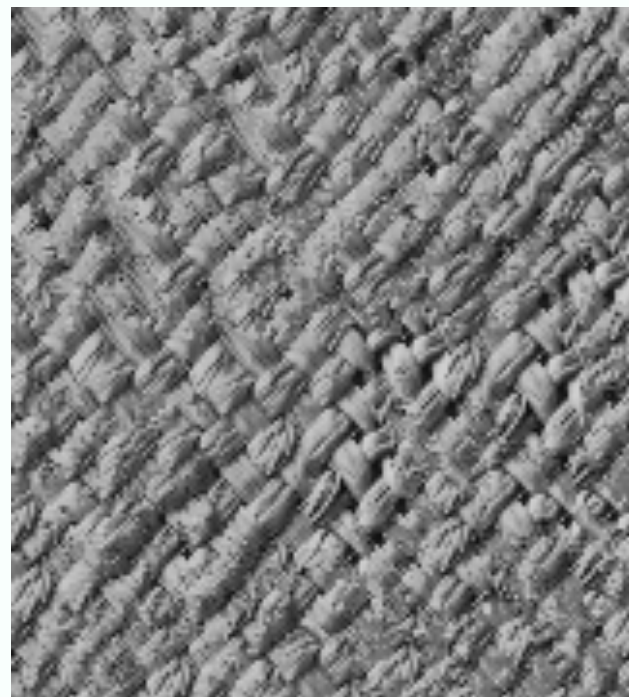


More Results

french canvas



rafia weave



wood



More Results

granite

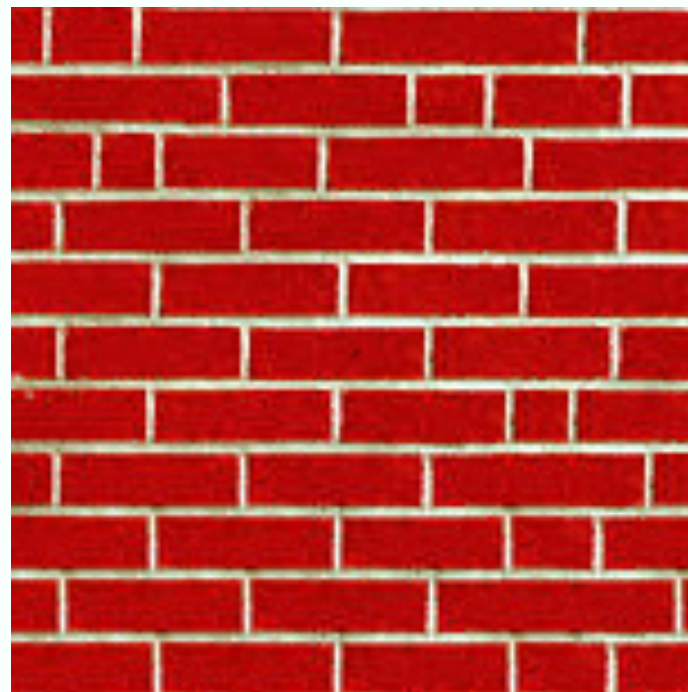


white bread

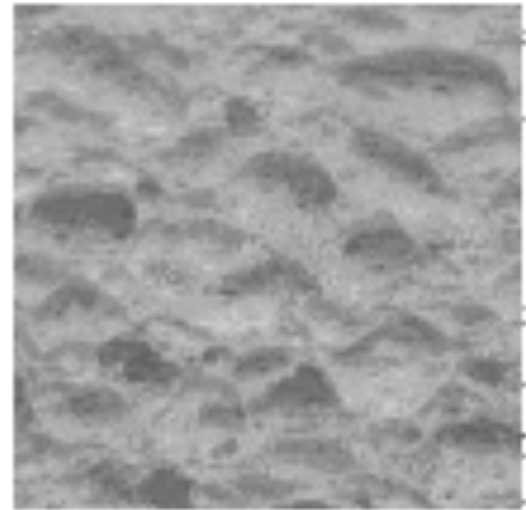
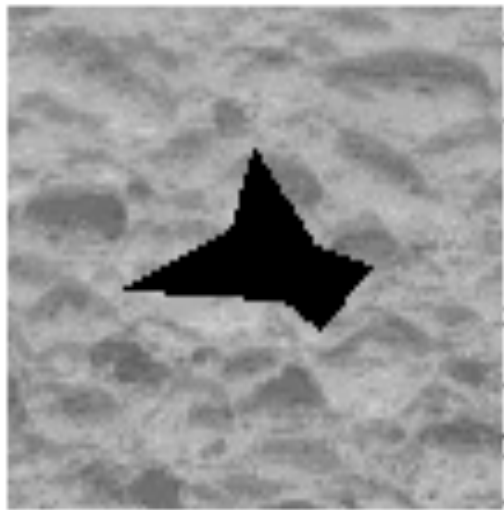


More Results

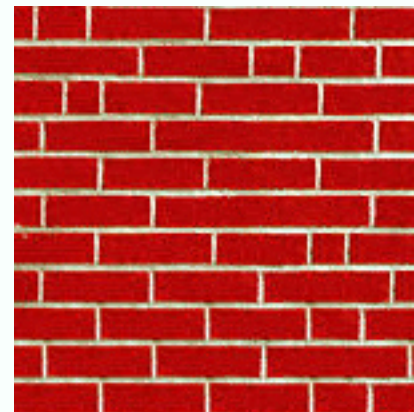
brick wall



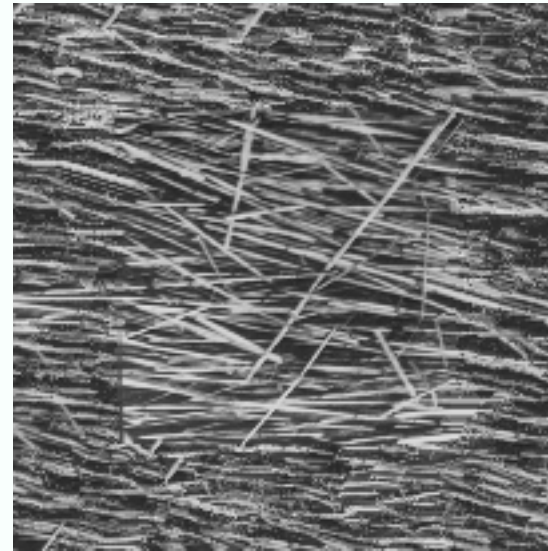
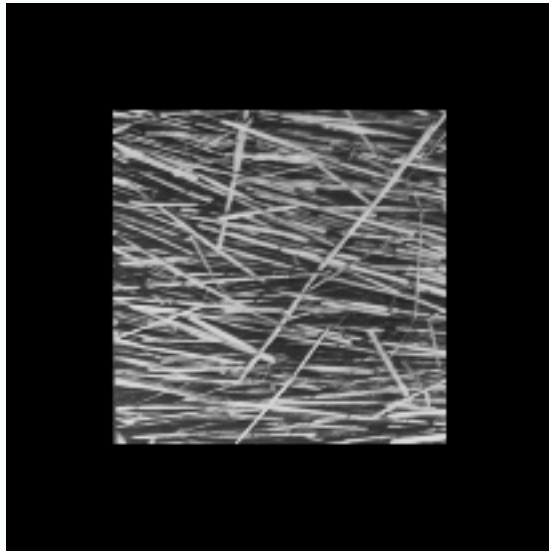
Growing Regions Hole Filling



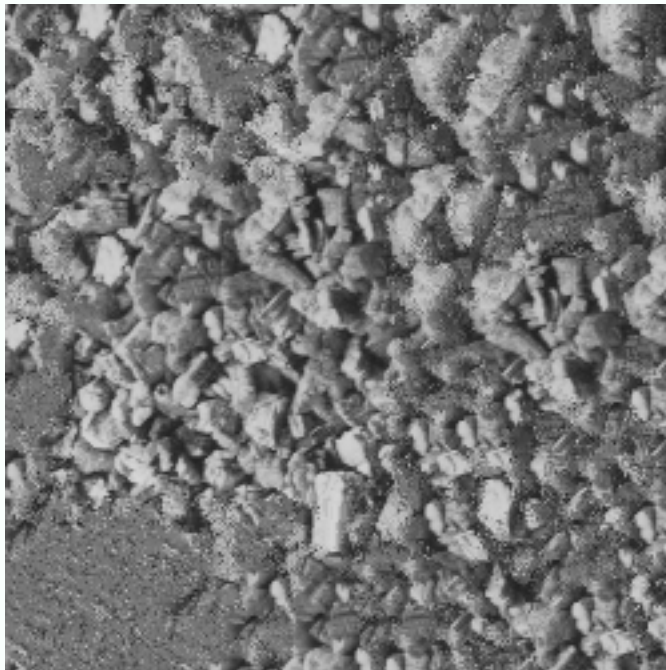
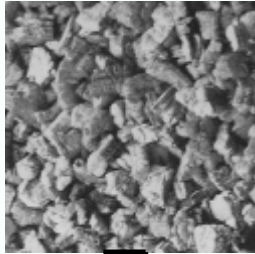
Hole Filling



Extrapolation



Failure Cases



Growing garbage



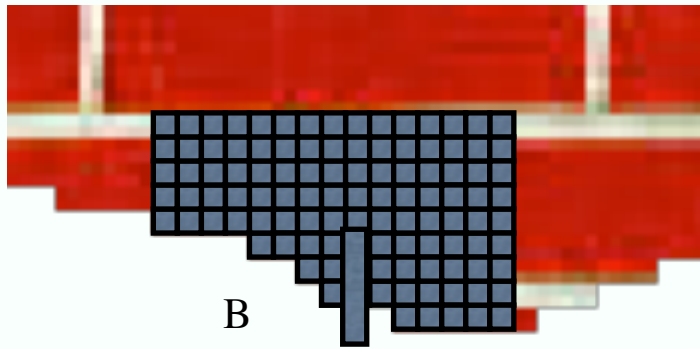
Verbatim copying

Pros and Cons

- Very simple
- Easy to implement
- Promising results

- Very sloooooooooowwwwwww
- Idea:
 - Patches instead of pixels

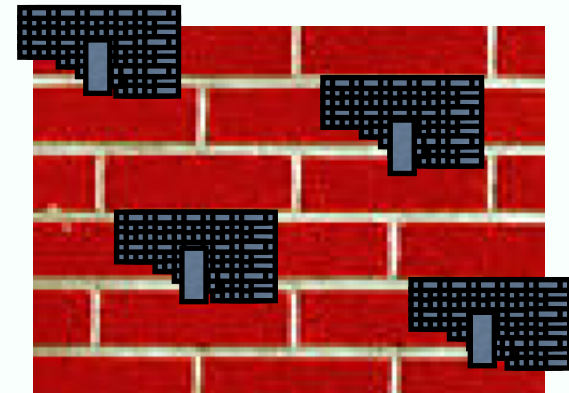
Patch based



Synthesizing a block

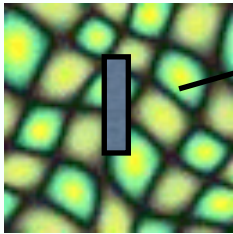
non-parametric
sampling

A large blue arrow points from the input image on the right towards the synthesis diagram on the left, indicating the direction of the non-parametric sampling process.



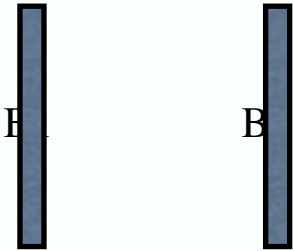
Input image

- **Observation**
 - neighbouring pixels are highly correlated
- **Idea:**
 - unit of synthesis = block

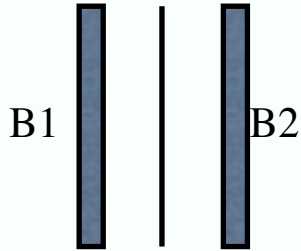


block

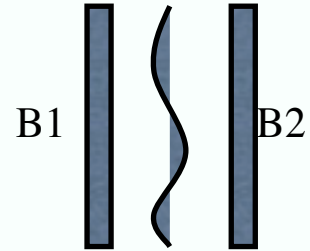
Input texture



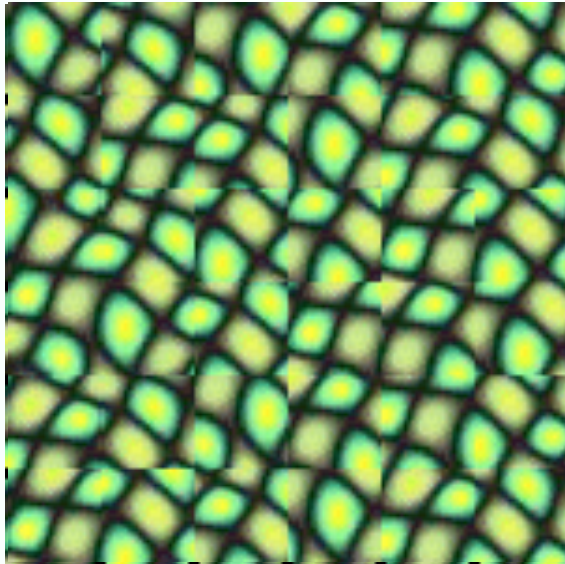
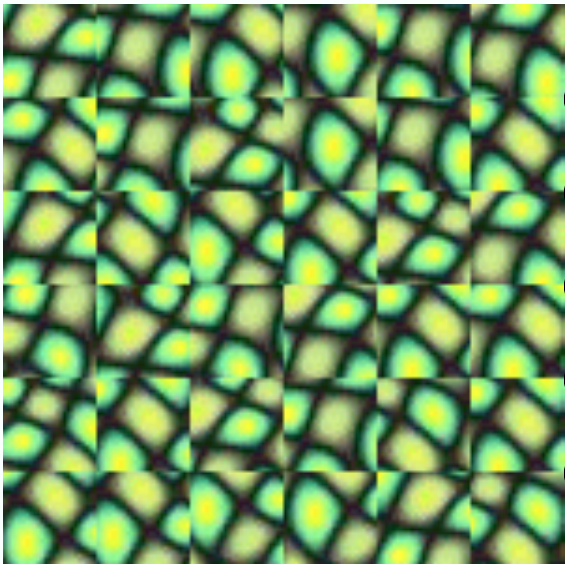
Random placement
of blocks



Neighboring blocks
constrained by overlap

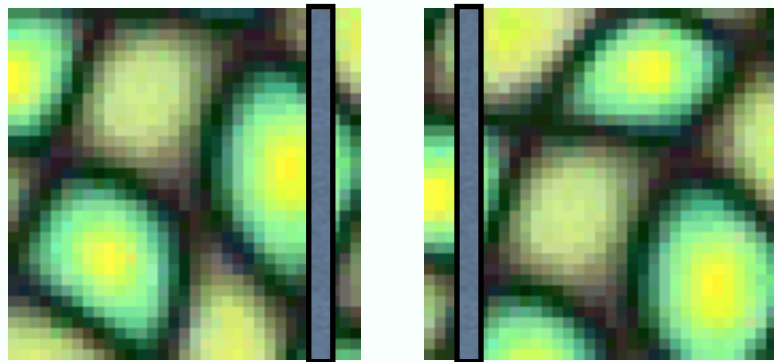


Minimal error
boundary cut

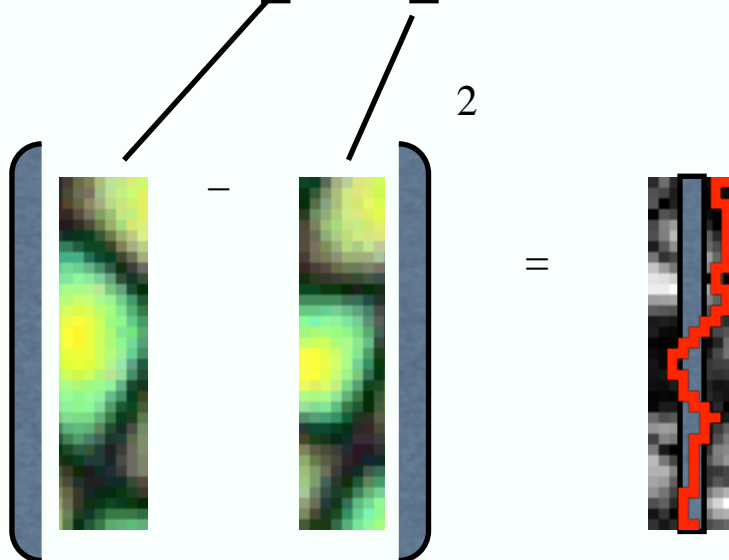
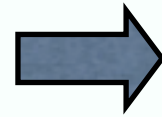
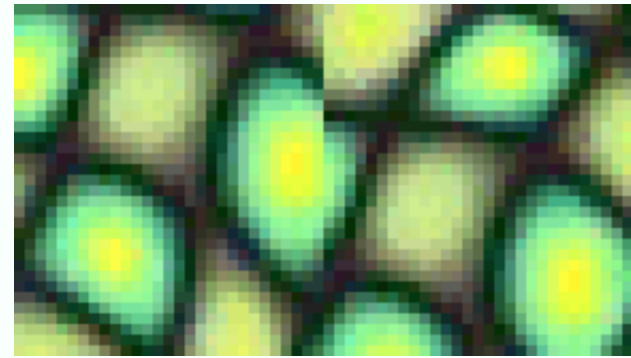


Minimal error boundary

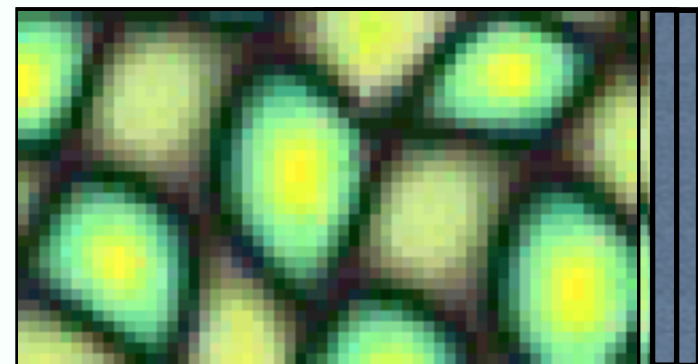
overlapping blocks



vertical boundary

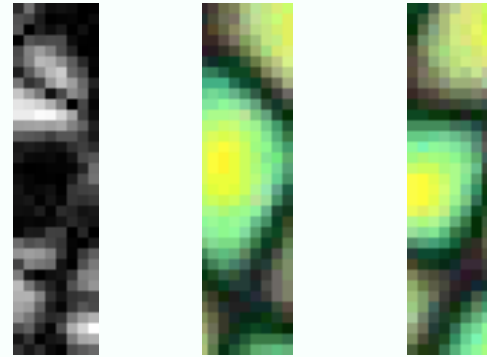
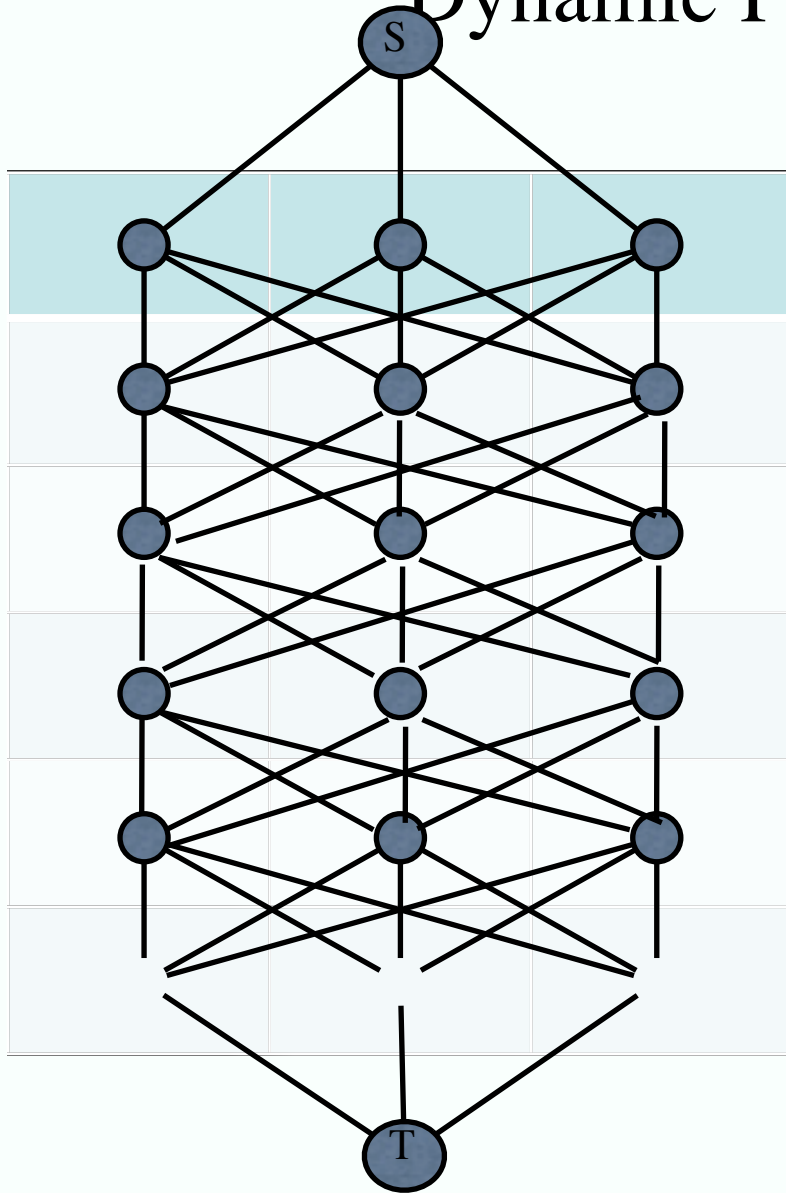


overlap error



min. error boundary

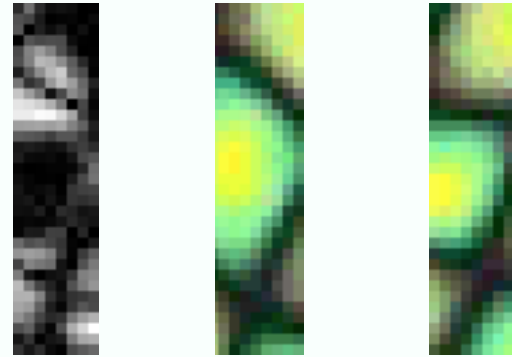
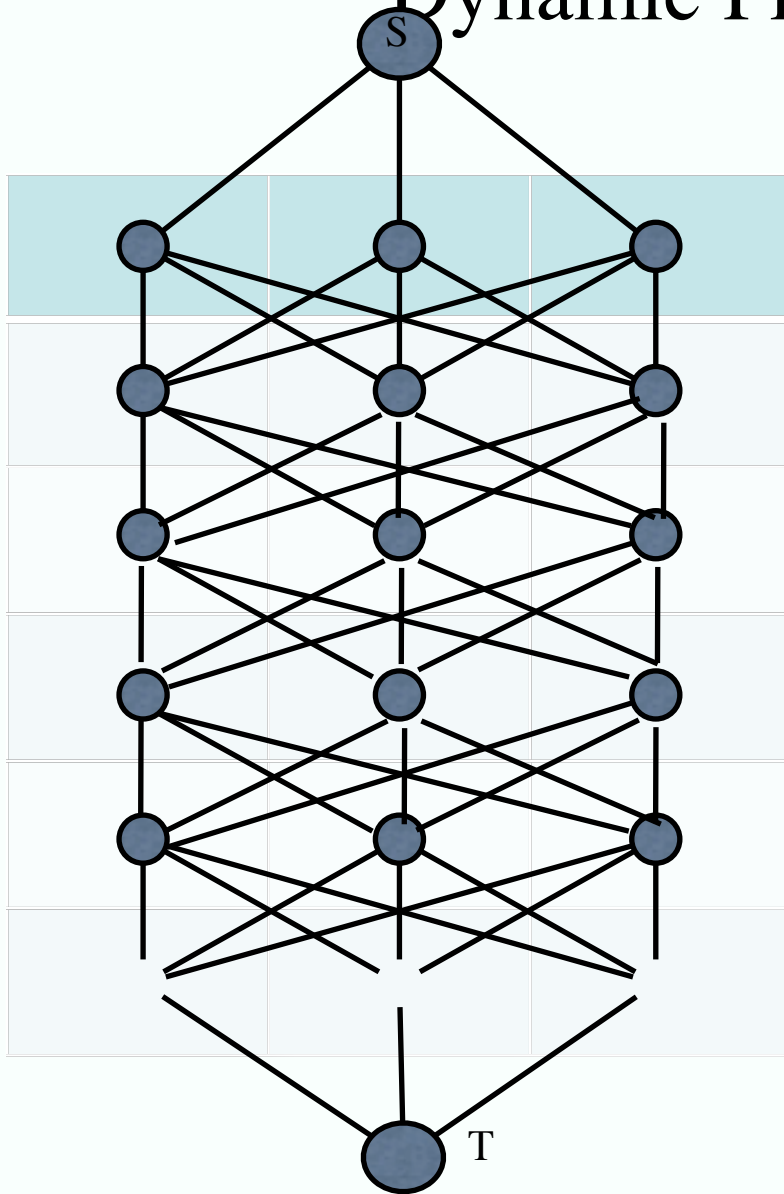
Dynamic Programming



$$e_{ij} = (B1_{ij}^{ov} - B2_{ij}^{ov})^2$$

$$E_{i,j} = e_{i,j} + \min(E_{i-1,j-1}, E_{i-1,j}, E_{i-1,j+1})$$

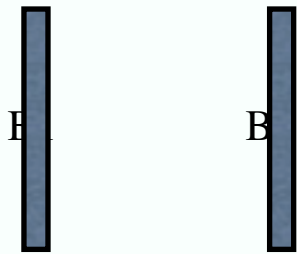
Dynamic Programming



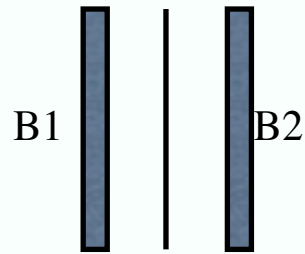
$$e_{ij} = (B1_{ij}^{ov} - B2_{ij}^{ov})^2$$

$$E_{i,j} = e_{i,j} + \min(E_{i-1,j-1}, E_{i-1,j}, E_{i-1,j+1})$$

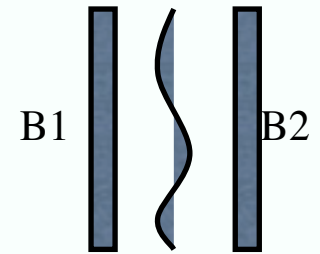




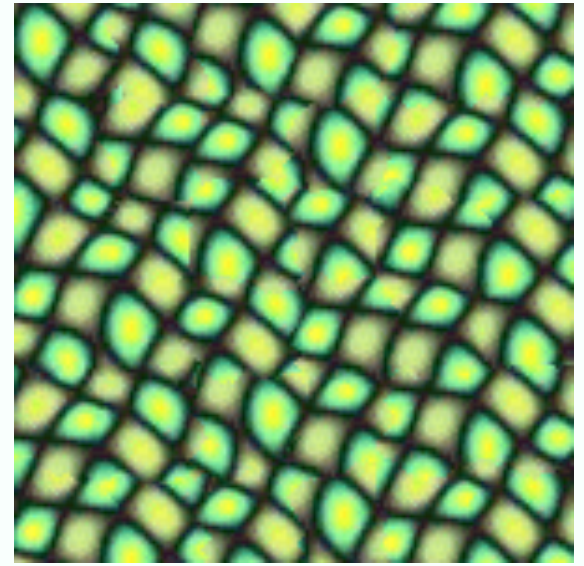
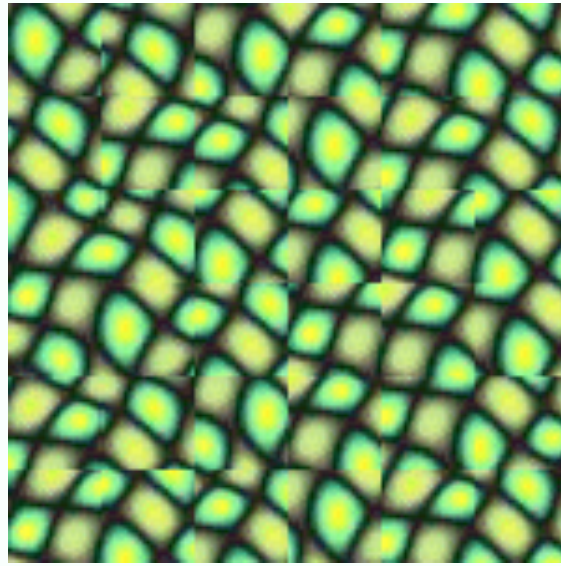
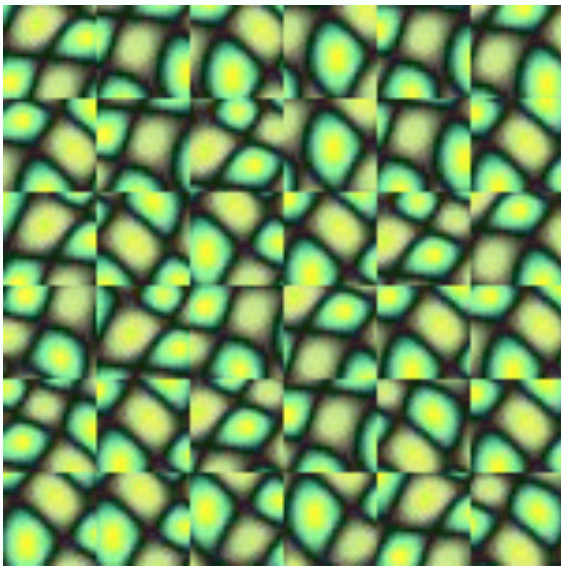
Random placement
of blocks



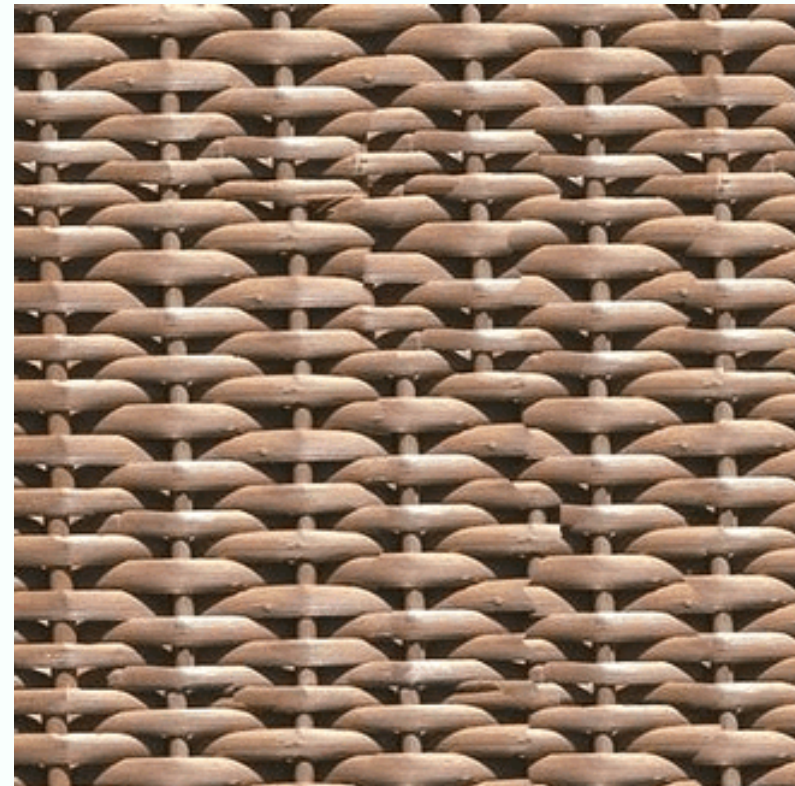
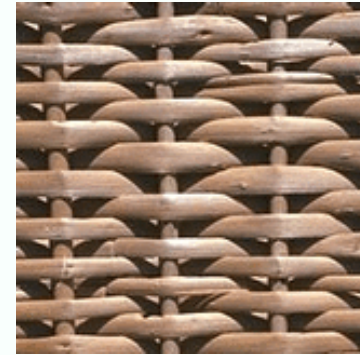
Neighboring blocks
constrained by overlap

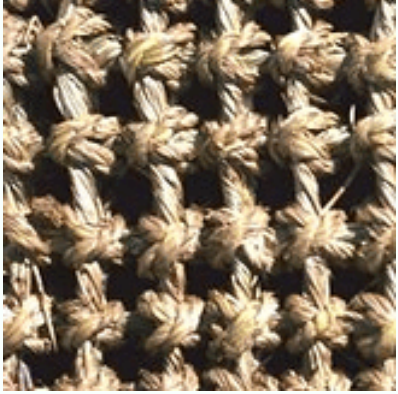


Minimal error
boundary cut

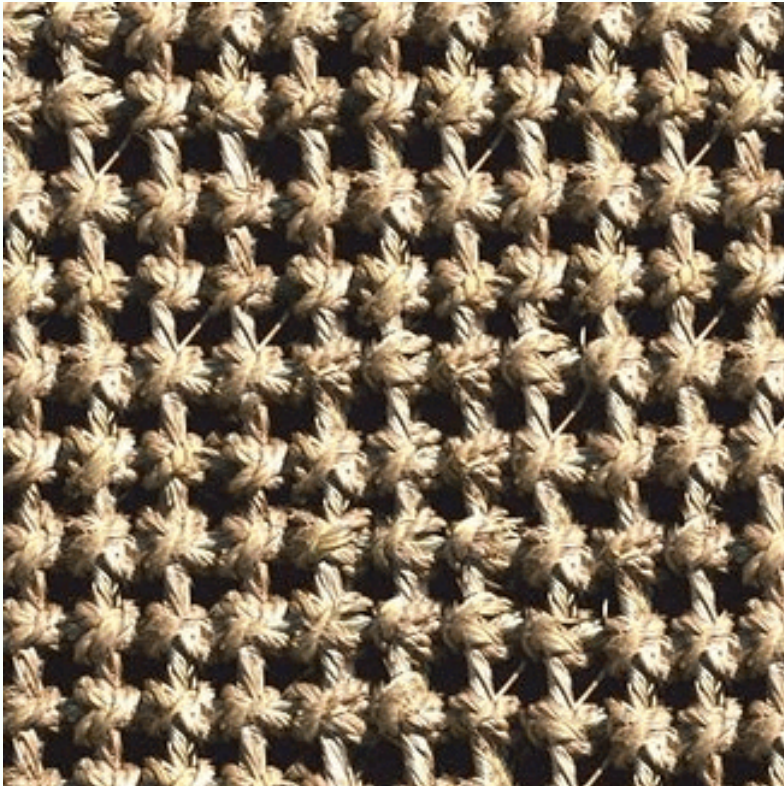


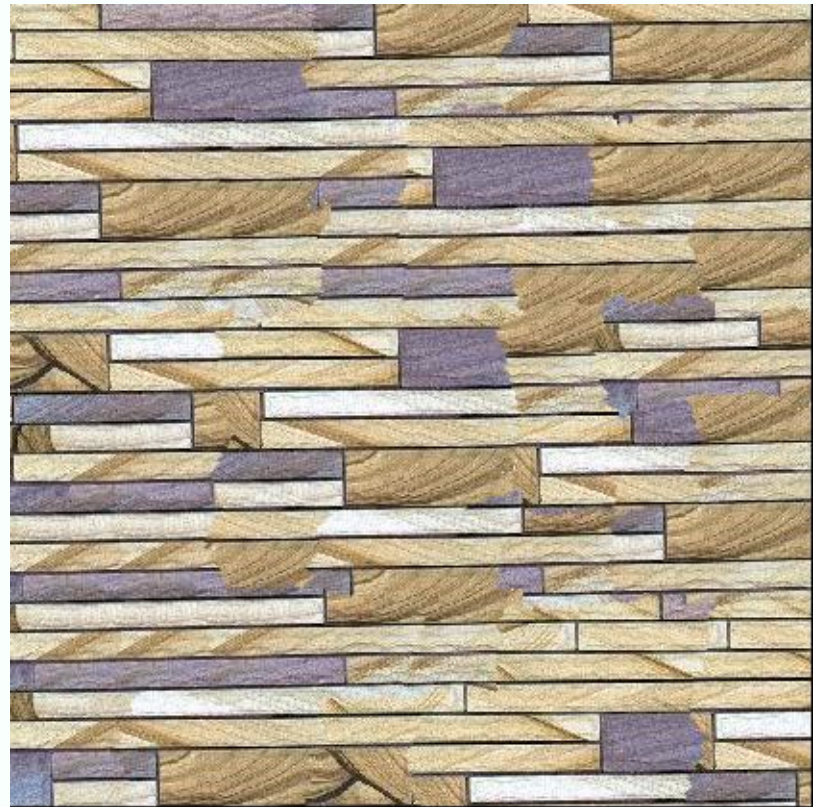
More Results



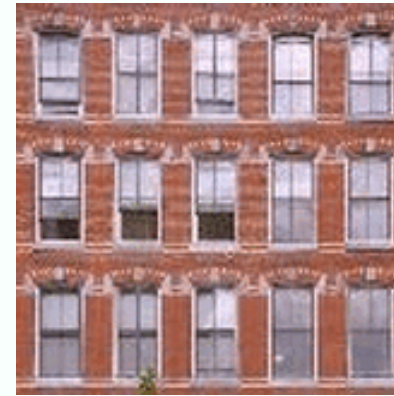


More Results



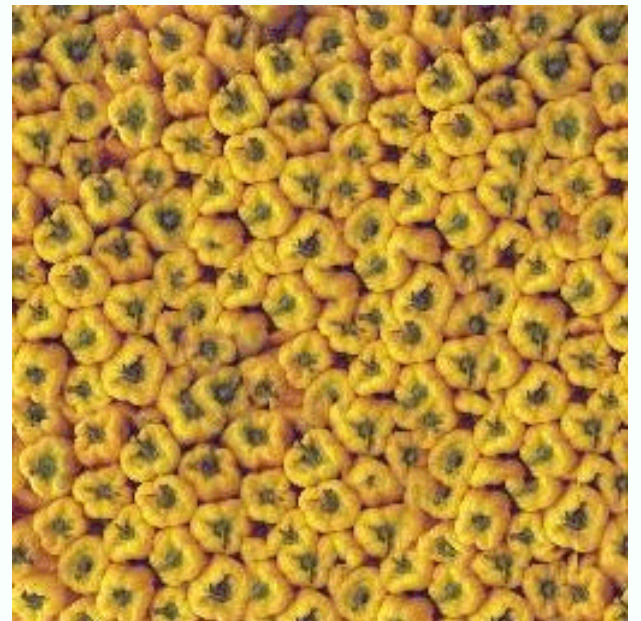
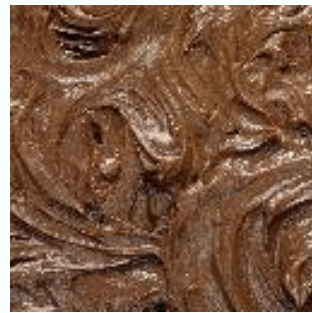
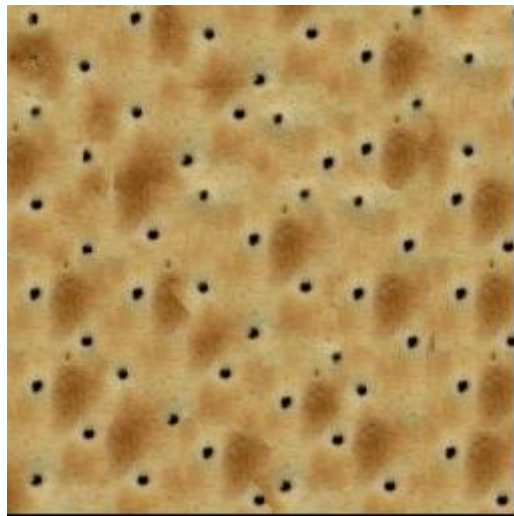
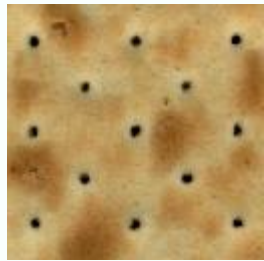


Efros & Freeman SIGGRAPH01



Efros & Freeman SIGGRAPH01

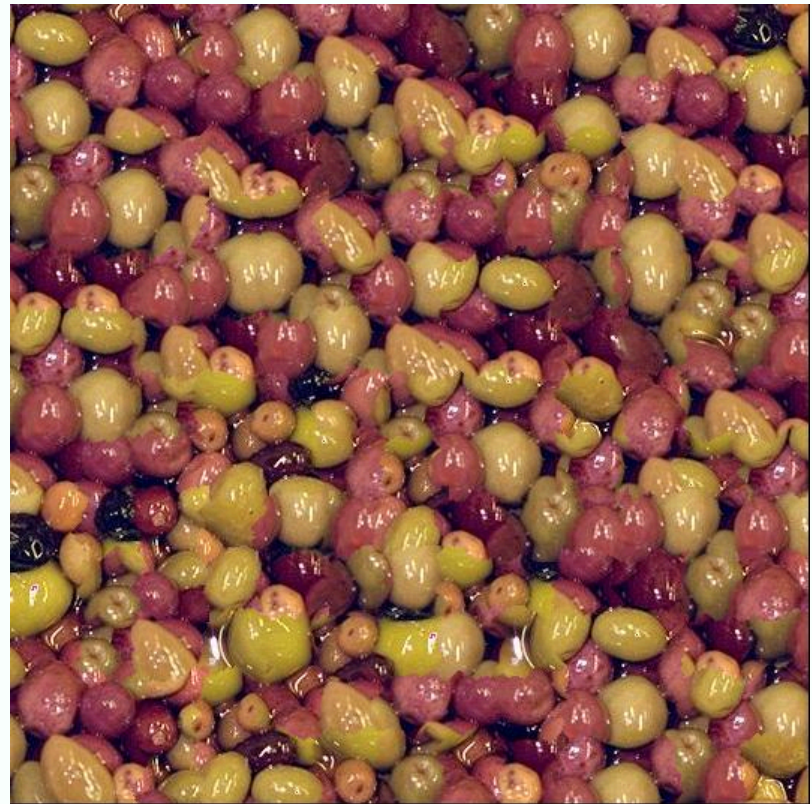
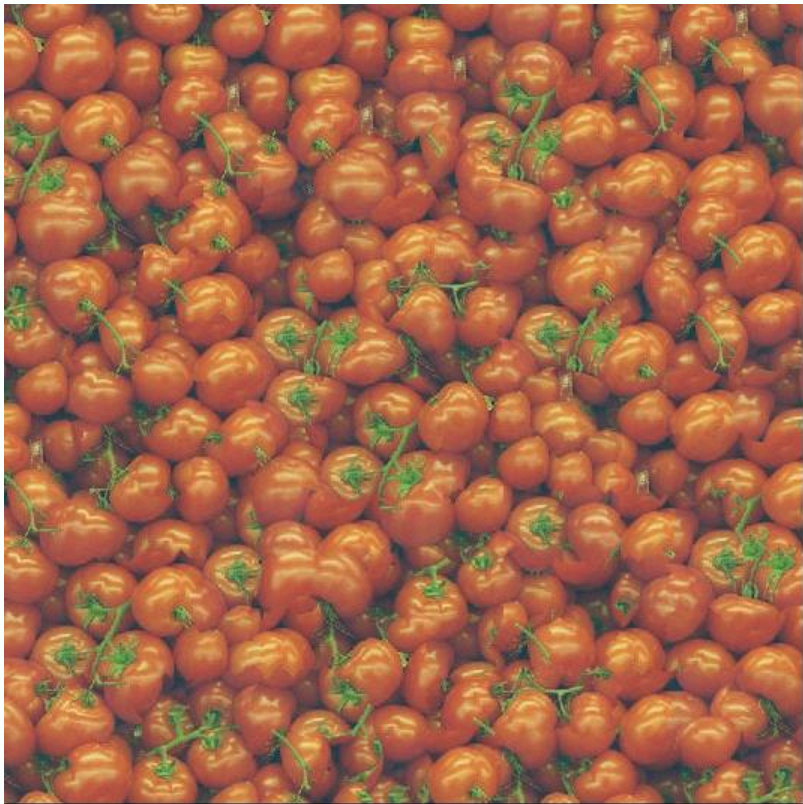




Efros & Freeman SIGGRAPH01

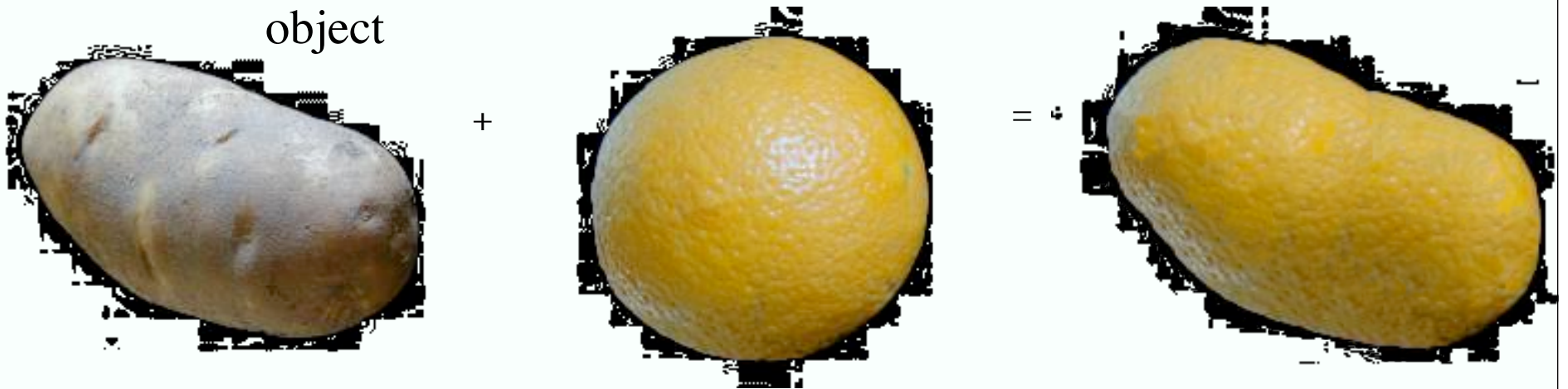


Failures



Texture Transfer

- Take the texture from one object and paint it on another object



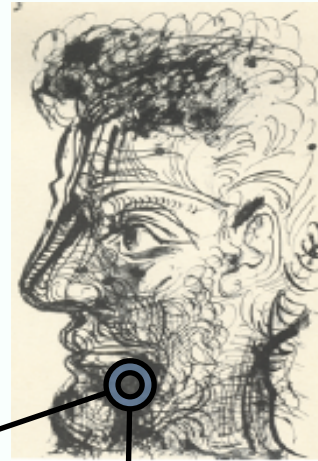
Decomposing shape and texture

Very challenging

Walk around

Add some constraint to the search

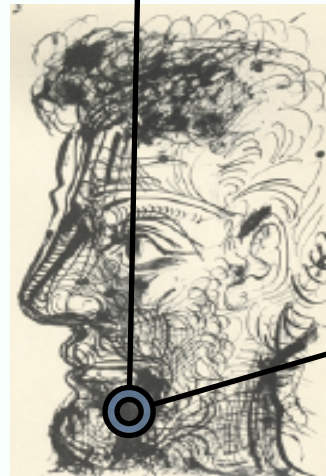
Source Texture



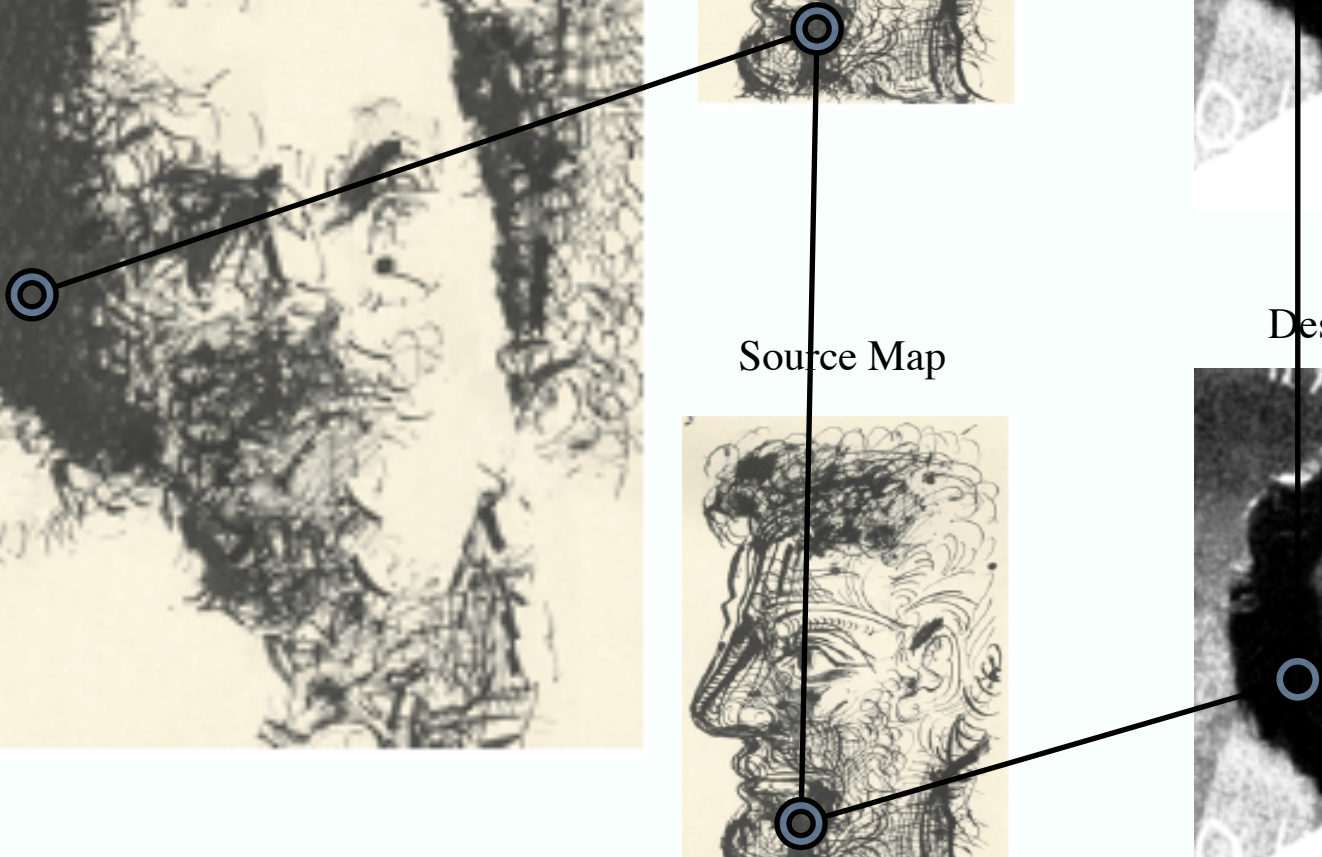
Destination

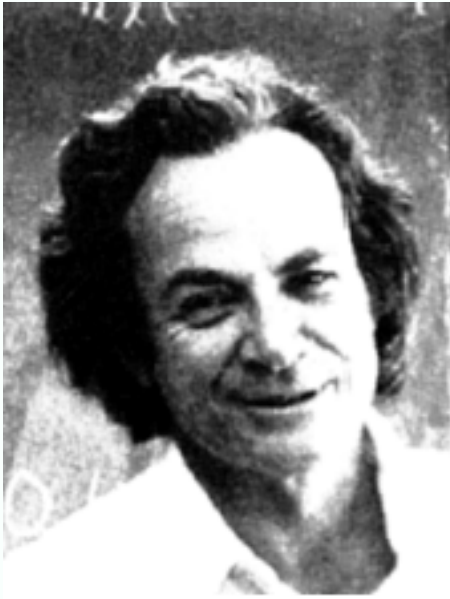


Source Map

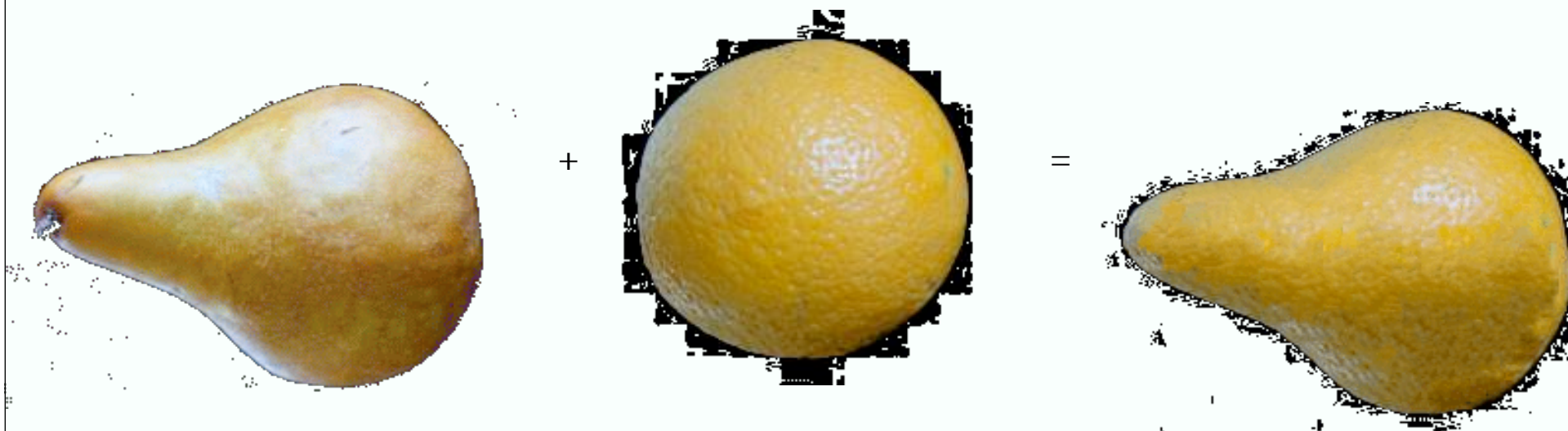


Destination Map





Texture Transfer



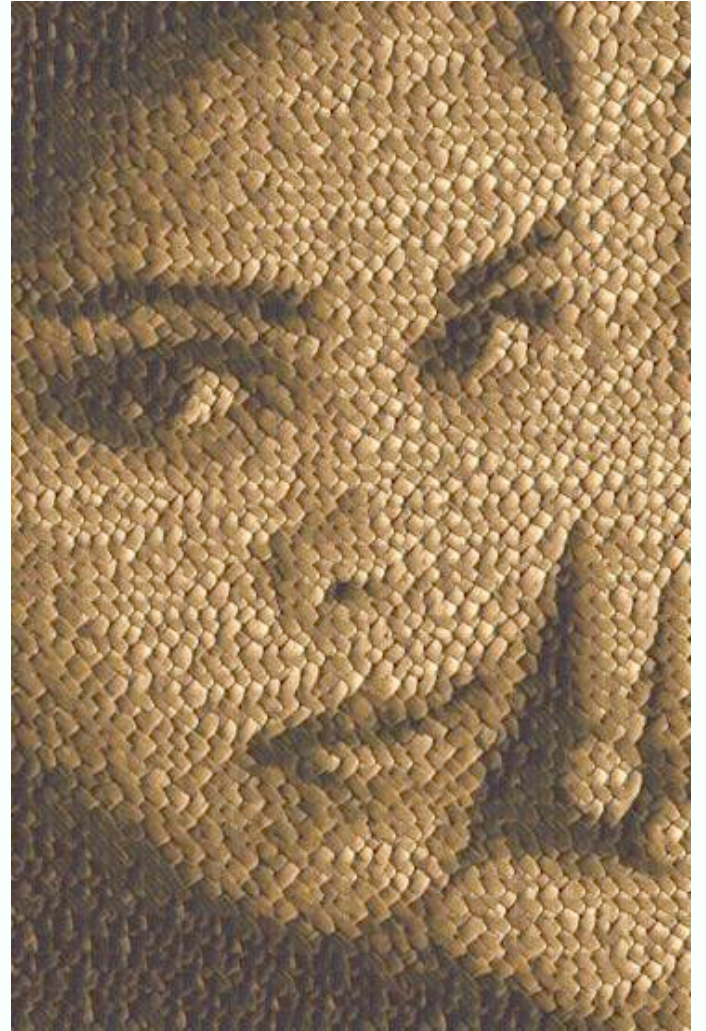


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Efros & Freeman SIGGRAPH01

parmesan



+



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rice



+



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Image Analogies



A

:



A'

::



B

:



B'

Image Analogies

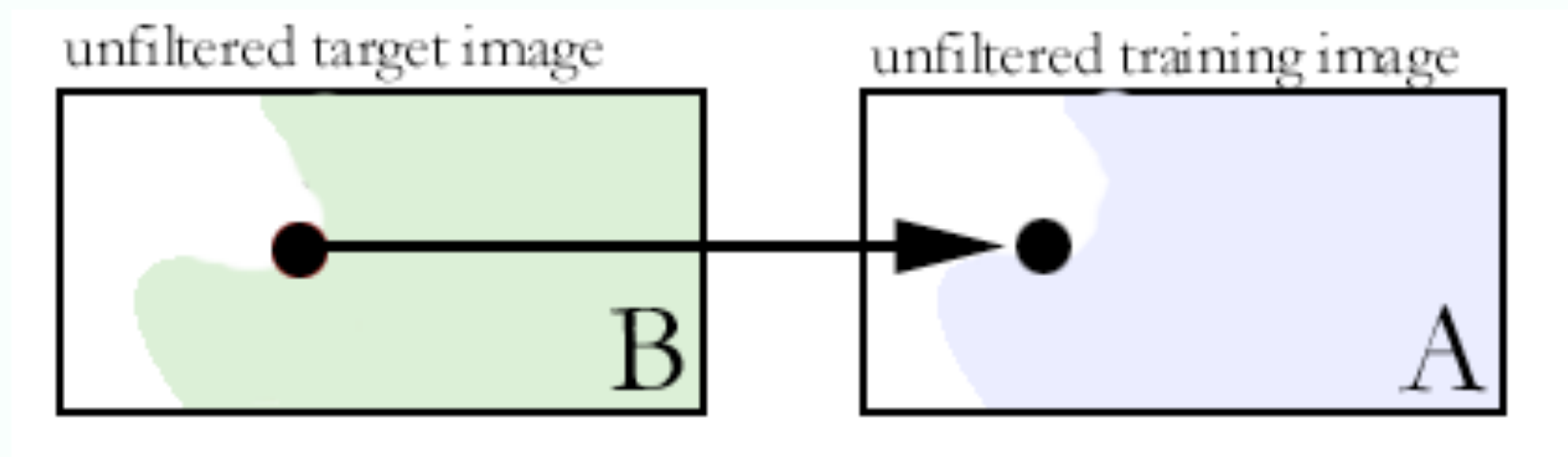


Image Analogies

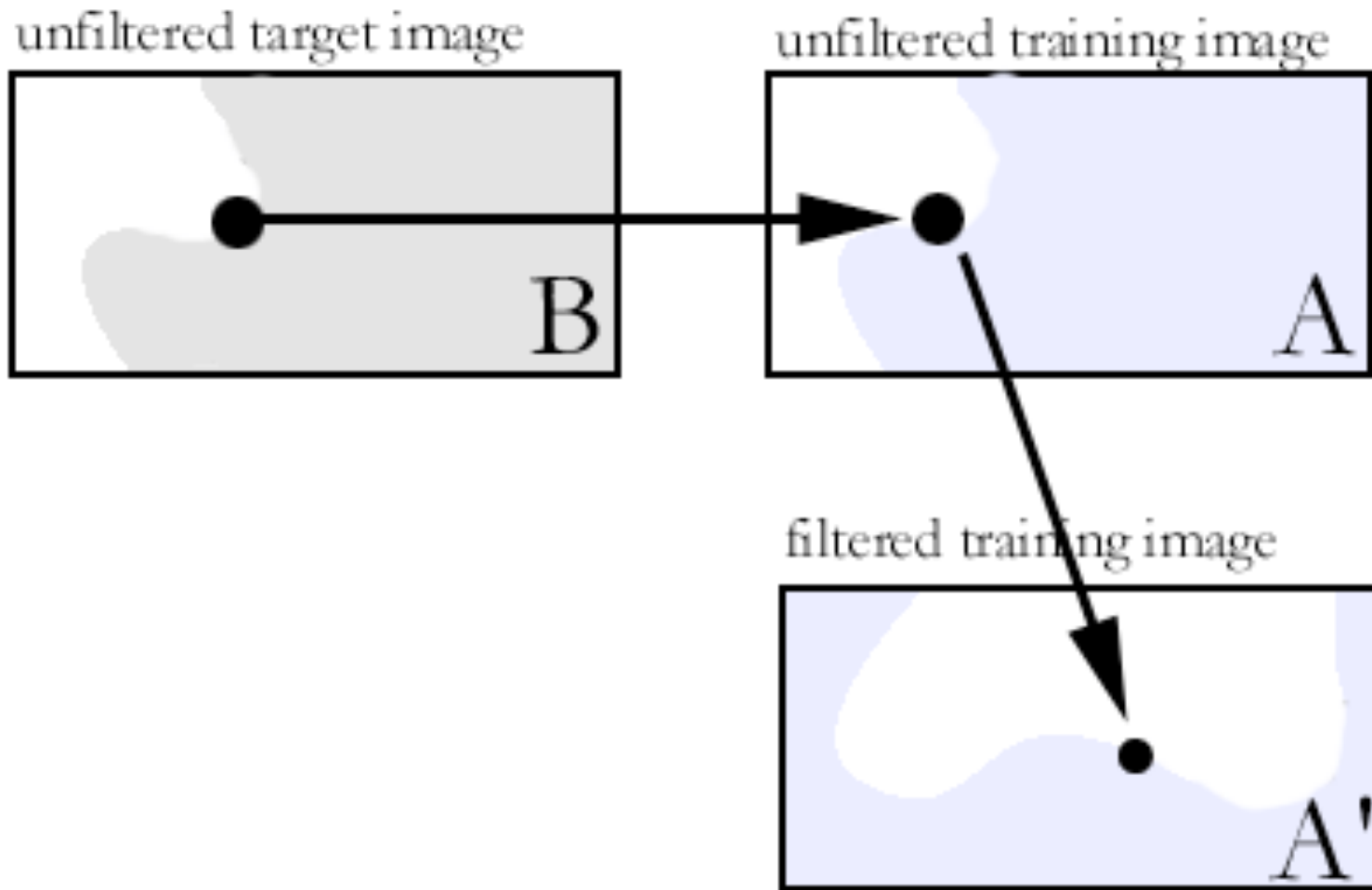
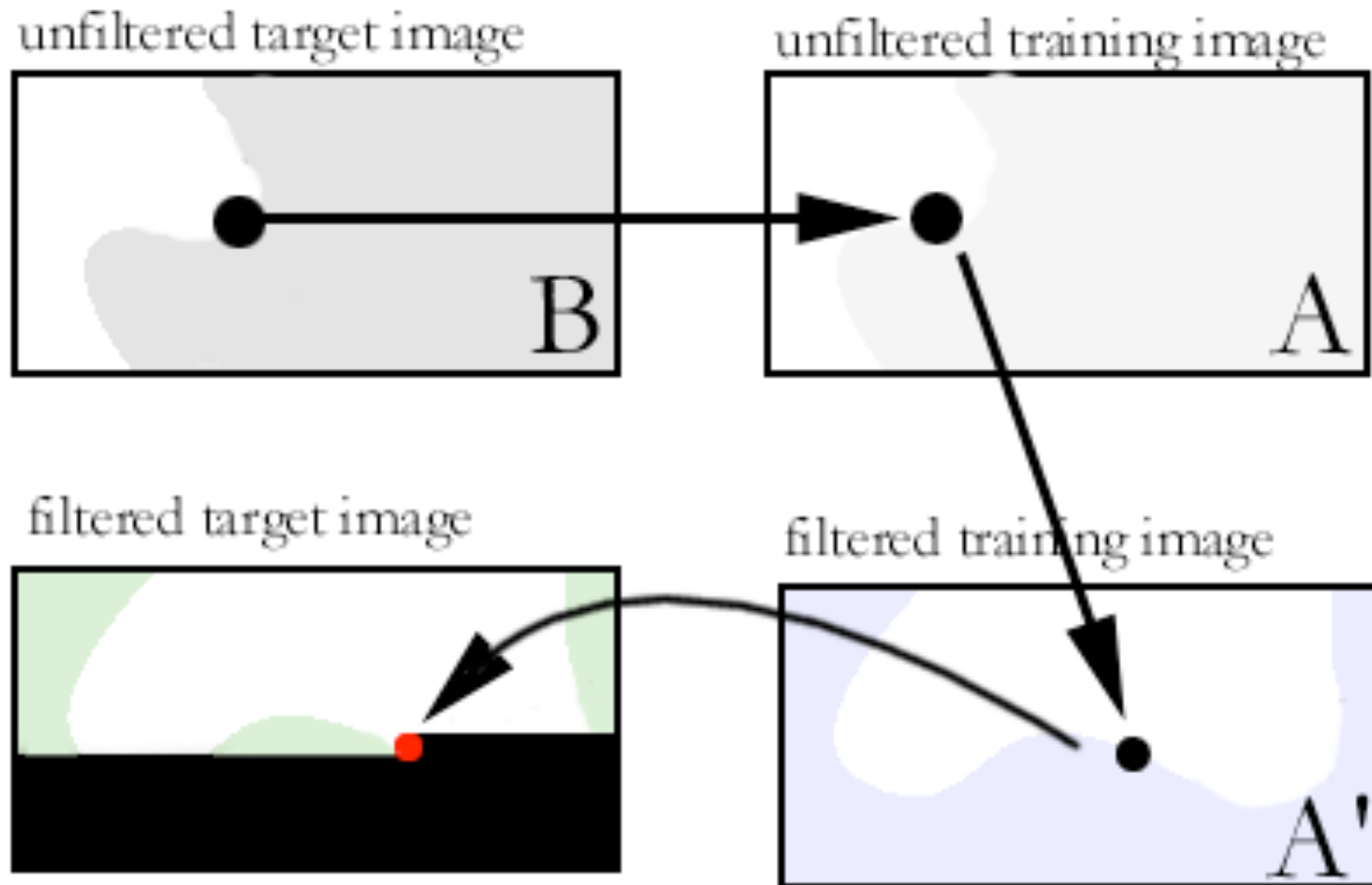


Image Analogies



Training



Unfiltered source (A)



Filtered source (A')



B



B'



Hertzman, Jacobs, Oliver, Curless, and Salesin, SIGGRAPH01



B



B'



Hertzman, Jacobs, Oliver, Curless, and Salesin, SIGGRAPH01

Learn to Blur



Unfiltered source (A)



Filtered source (A')



Unfiltered target (B)



Filtered target (B')

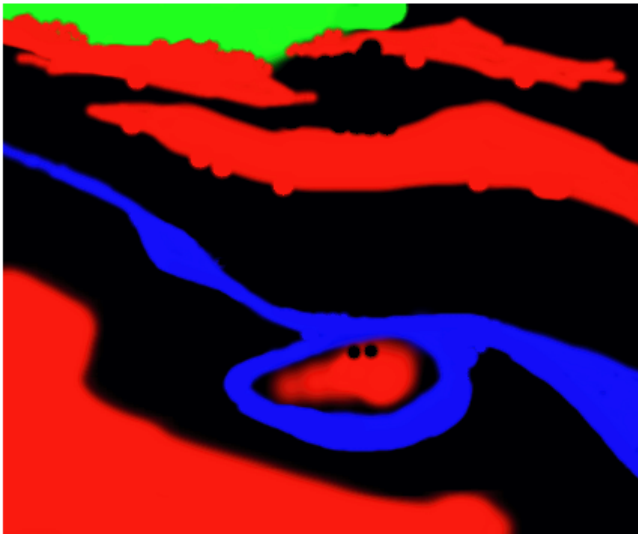
Texture by Numbers



Unfiltered source (A)



Filtered source (A')



Unfiltered (B)



Filtered (B')

Colorization



Unfiltered source (A)

▪
▪



Filtered source (A')

▪ ▪
▪ ▪



Unfiltered target (B)

▪
▪

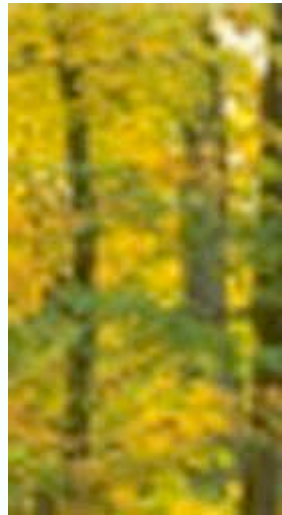


Filtered target (B')

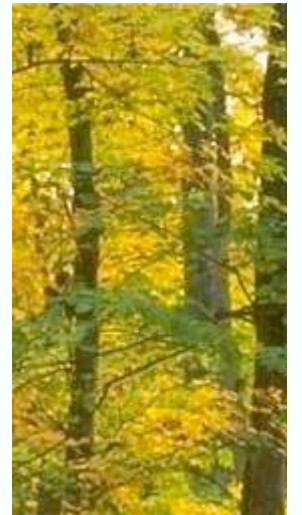
Super-resolution



A



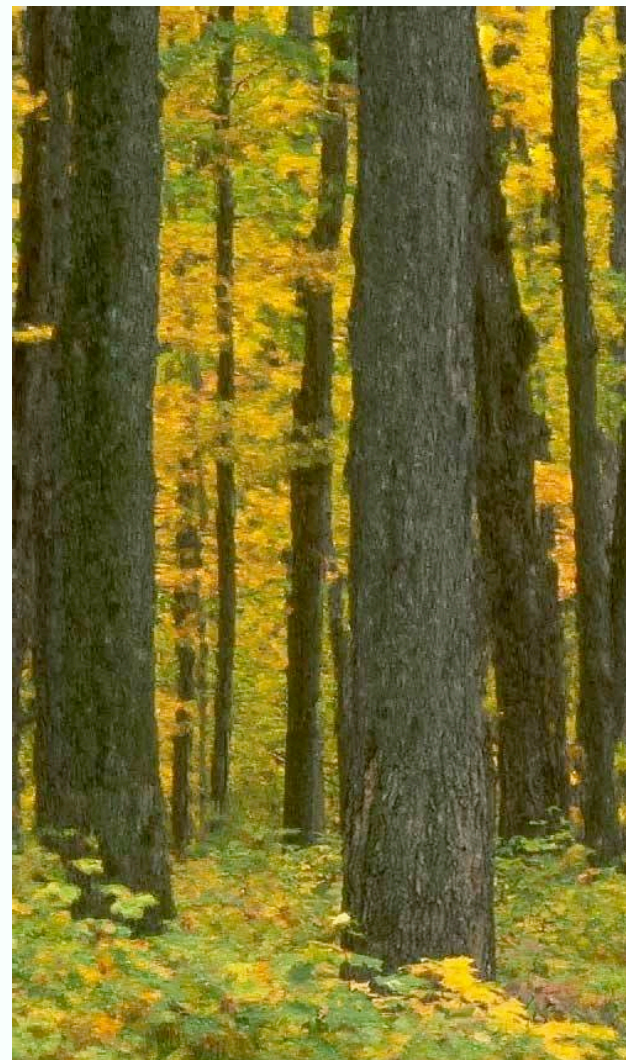
A'



Super-resolution (result!)



B



B'

Training images



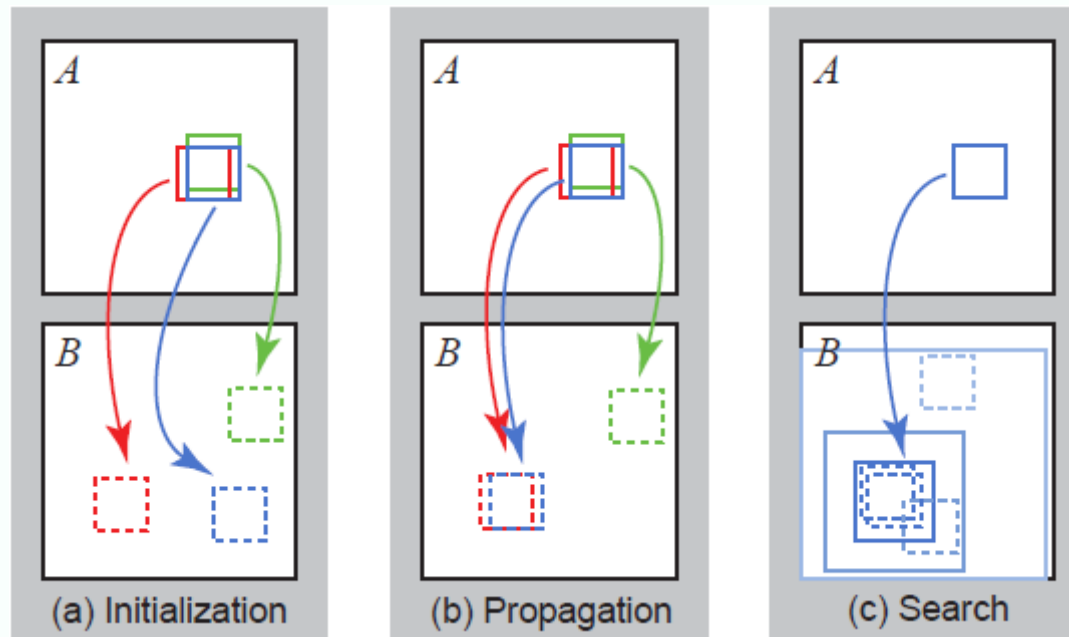


Hertzman, Jacobs, Oliver, Curless, and Salesin, SIGGRAPH01

Nearest Neighbor search

The core of most of the patch based methods
Very slow

Smarter neighborhood search



Applications



(a) original

(b) hole+constraints

(c) hole filled

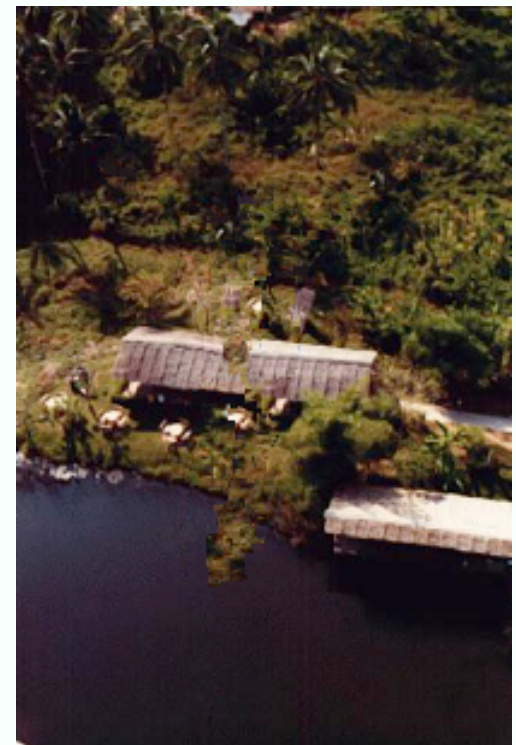


(d) constraints

(e) constrained retarget

(f) reshuffle

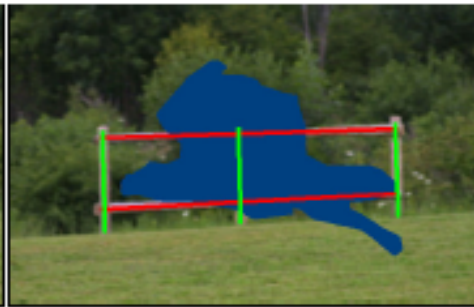
Inpainting



Inpainting



(a) input



(b) hole and guides



(c) completion result



(d) input



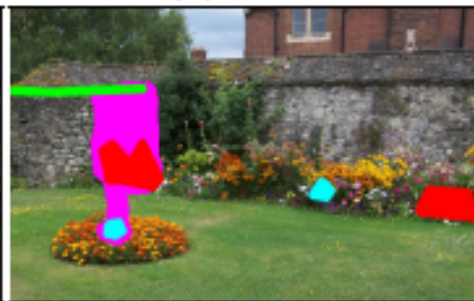
(e) hole



(f) completion (close up)



(g) same input



(h) hole and guides



(i) guided (close up)

Retargeting



Avidan, Shamir, SIGGRAPH07



Seam removal



Scaling



Cropping

Retargeting



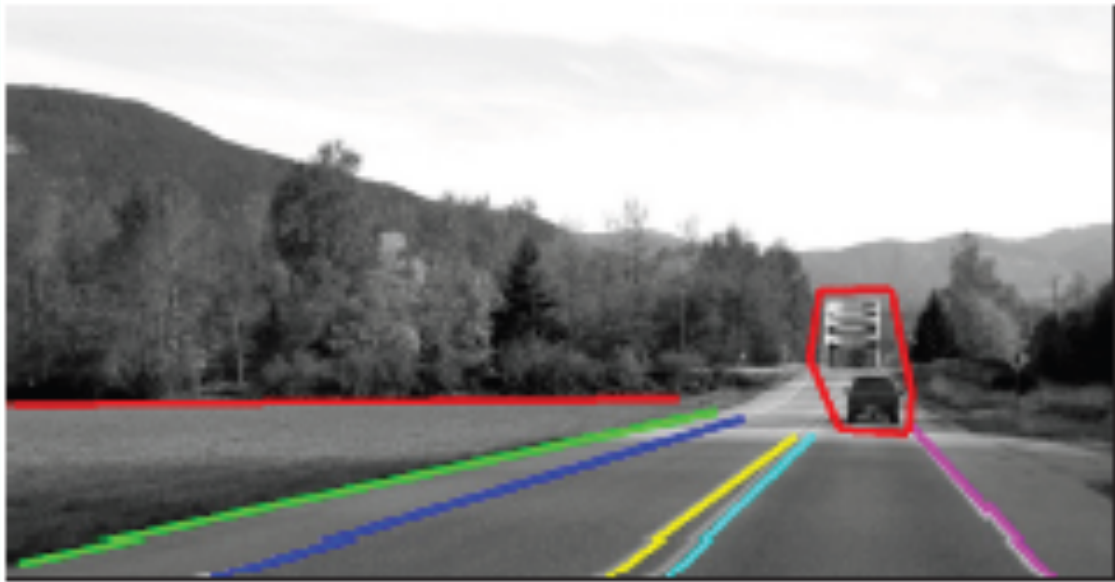


Avidan, Shamir, SIGGRAPH07

Retargeting



Retargeting



Local scale editing



(a) building marked by user



(b) scaled up, preserving texture



(c) bush marked by user



(d) scaled up, preserving texture.

reshuffling



(a) input

(b) our reshuffling



(a)

(b)

(c)



(d)

(e)

(f)



(g)

(h)

(i)

(j)