



**6.098 Digital and Computational Photography**  
**6.882 Advanced Computational Photography**

# **Image Warping and Morphing**

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# Olivier Gondry's visit

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- Thursday Friday
- Contact Peter Sand: [sand@mit.edu](mailto:sand@mit.edu)

# Important scientific question

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- How to turn Dr. Jekyll into Mr. Hyde?
- How to turn a man into a werewolf?
- Powerpoint cross-fading?



# Important scientific question

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- How to turn Dr. Jekyll into Mr. Hyde?
- How to turn a man into a werewolf?
- Powerpoint cross-fading?



From An American Werewolf in London

- or
- Image Warping and Morphing?

# Digression: old metamorphoses

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- [http://en.wikipedia.org/wiki/The Strange Case of Dr. Jekyll and Mr. Hyde](http://en.wikipedia.org/wiki/The_Strange_Case_of_Dr._Jekyll_and_Mr._Hyde)
- <http://www.eatmybrains.com/showtopten.php?id=15>
- [http://www.horror-wood.com/next\\_gen\\_jekyll.htm](http://www.horror-wood.com/next_gen_jekyll.htm)
- Unless I'm mistaken, both employ the trick of making already-applied makeup turn visible via changes in the color of the lighting, something that works only in black-and-white cinematography. It's an interesting alternative to the more familiar Wolf Man time-lapse dissolves. This technique was used to great effect on Fredric March in Rouben Mamoulian's 1932 film of *Dr. Jekyll and Mr. Hyde*, although Spencer Tracy eschewed extreme makeup for his 1941 portrayal.



# Averaging images

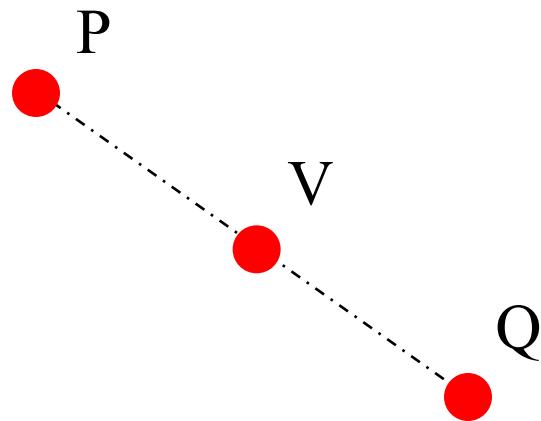
- Cross-fading
    - Pretty much the compositing equation
- $$C = \alpha F + (1 - \alpha) B$$



# Averaging vectors

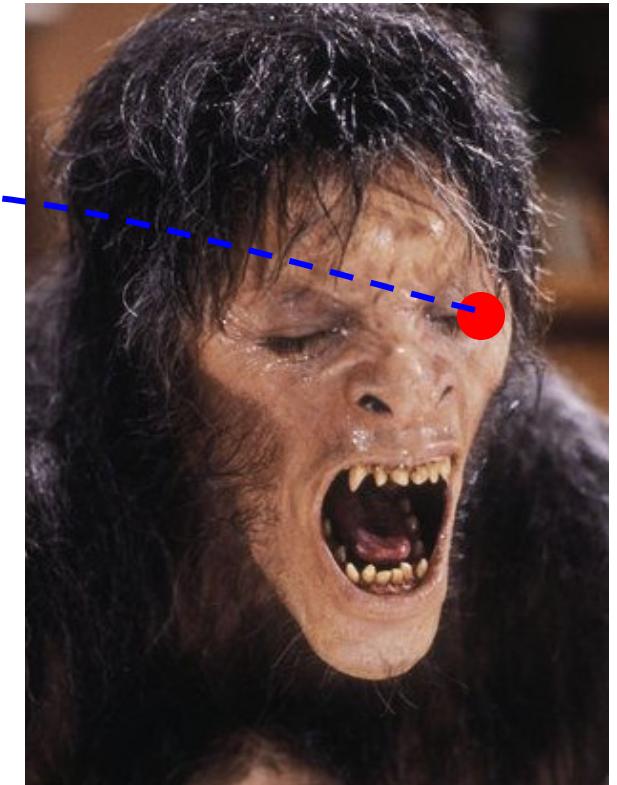
---

- $\mathbf{V} = \alpha \mathbf{P} + (1-\alpha) \mathbf{Q}$



# Warping & Morphing combine both

- For each pixel
  - Transform its location like a vector
  - Then linearly interpolate like an image



# Morphing

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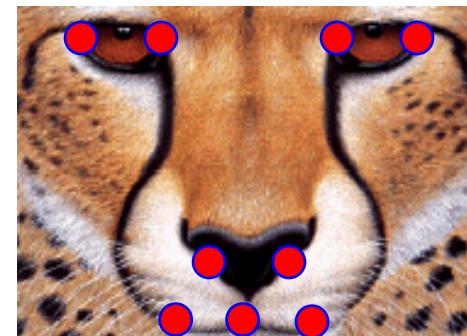
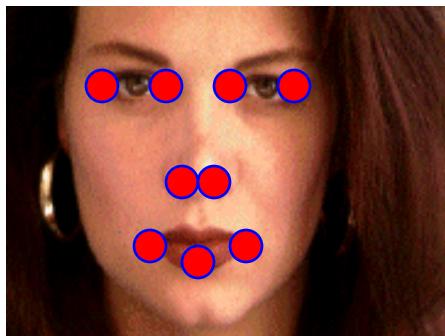
- Input: two images  $I_0$  and  $I_N$



- Expected output: image sequence  $I_i$ , with  $i \in 1..N-1$



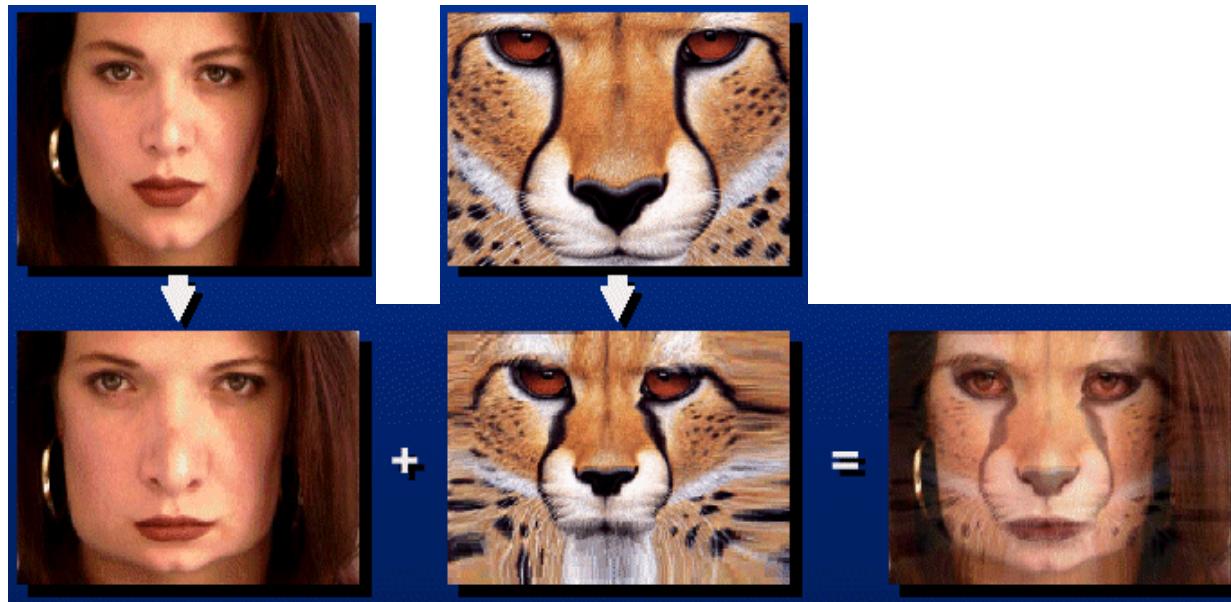
- User specifies sparse correspondences on the images
  - Pairs of vectors  $\{(P_j^0, P_j^N)\}$



# Morphing

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- For each intermediate frame  $I_t$ 
  - Interpolate feature locations  $P_i^t = (1-t) P_i^0 + t P_i^1$
  - Perform **two** warps: one for  $I_0$ , one for  $I_1$ 
    - Deduce a dense warp field from the pairs of features
    - Warp the pixels
  - Linearly interpolate the two warped images



# Warping

# Intelligent design & image warping

- D'Arcy Thompson
 

<http://www-groups.dcs.st-and.ac.uk/~history/Miscellaneous/darcy.html>

[http://en.wikipedia.org/wiki/D'Arcy\\_Thompson](http://en.wikipedia.org/wiki/D'Arcy_Thompson)
- Importance of shape and structure in evolution

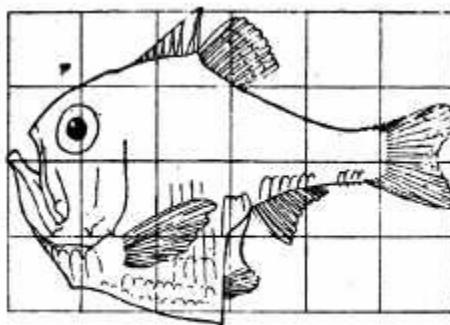
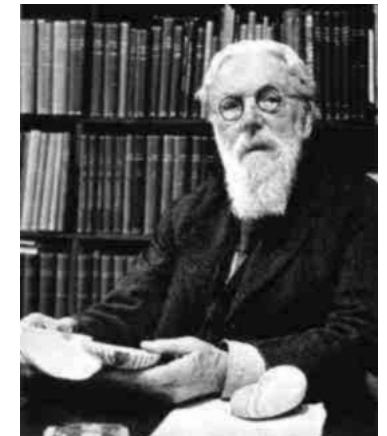


Fig. 517. *Argyropelecus Olfersi.*

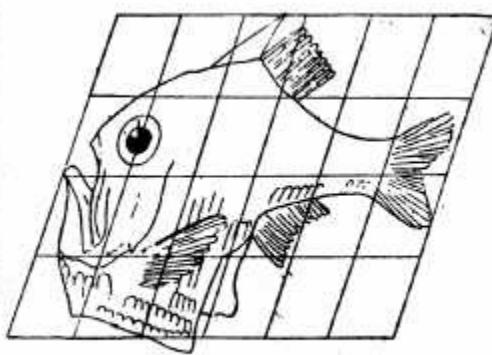
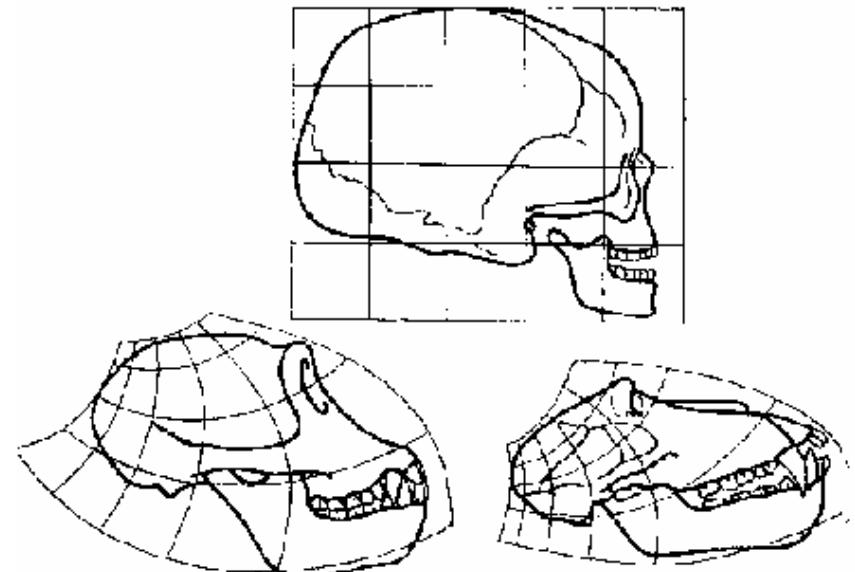


Fig. 518. *Sternopyx diaphana.*



Skulls of a human, a chimpanzee and a baboon  
and transformations between them

# Warping

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- Imagine your image is made of rubber
- warp the rubber

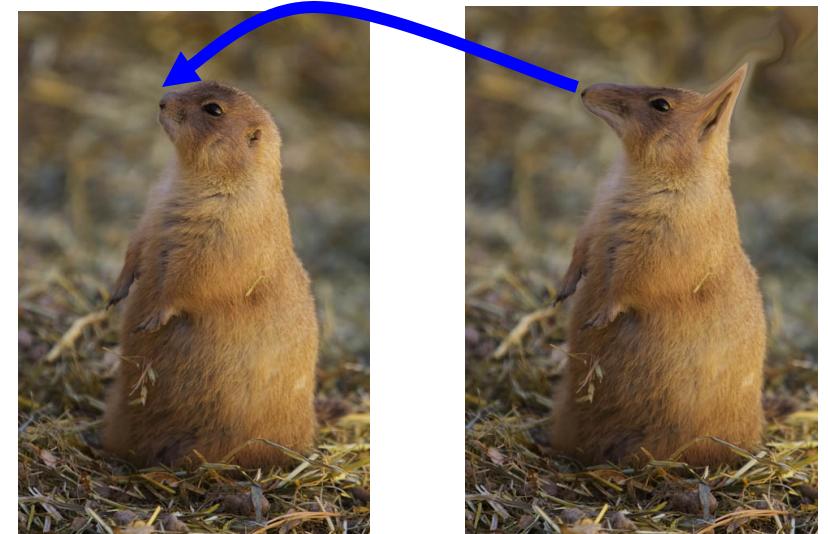
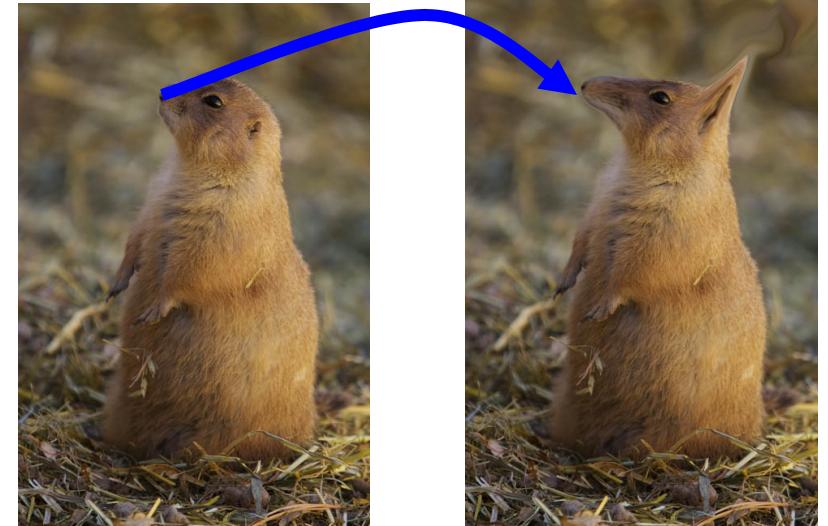


No prairie dogs were harmed when creating this image

# Careful: warp vs. inverse warp

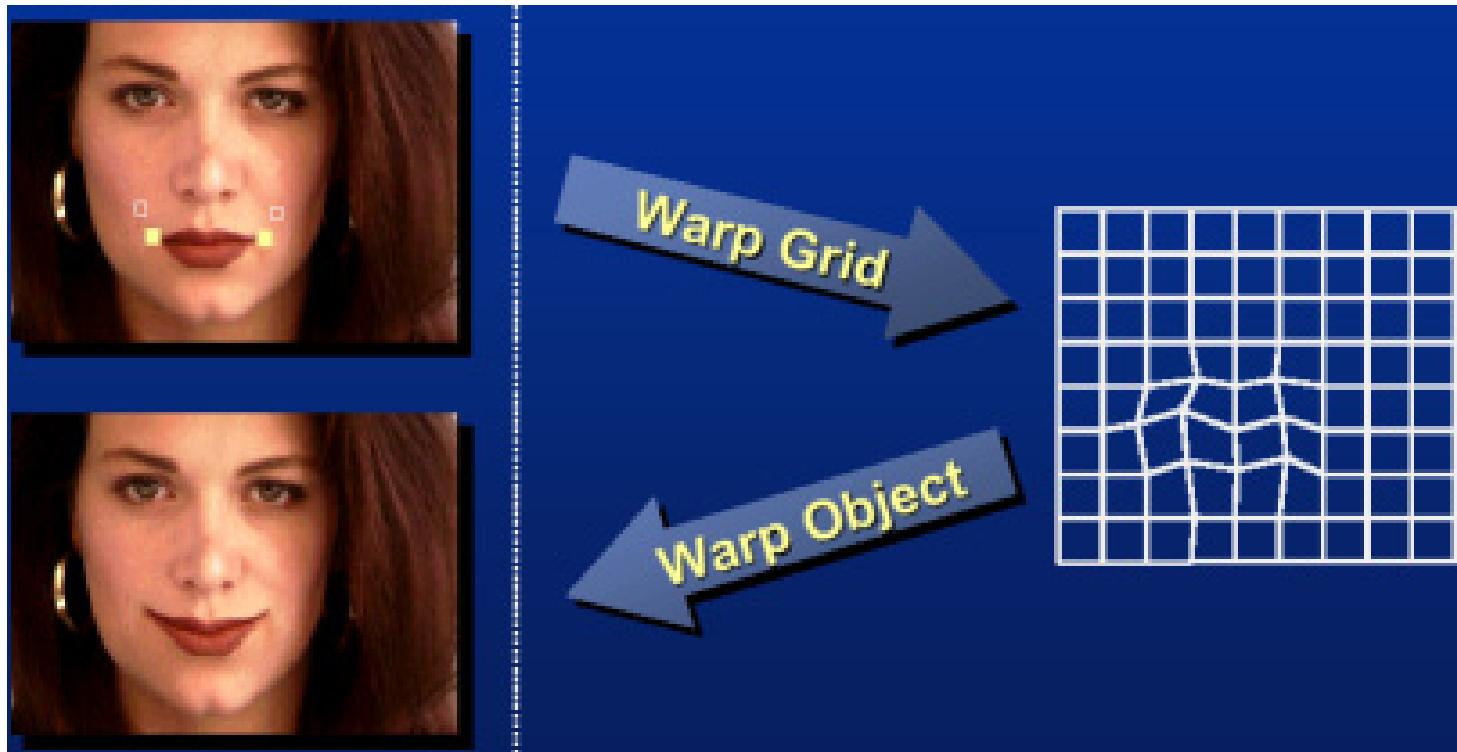
How do you perform a given warp:

- **Forward warp**
  - Potential gap problems
- **Inverse lookup the most useful**
  - For each output pixel
    - Lookup color at inverse-warped location in input



# Image Warping – non-parametric

- Move control points to specify a spline warp
- Spline produces a smooth vector field

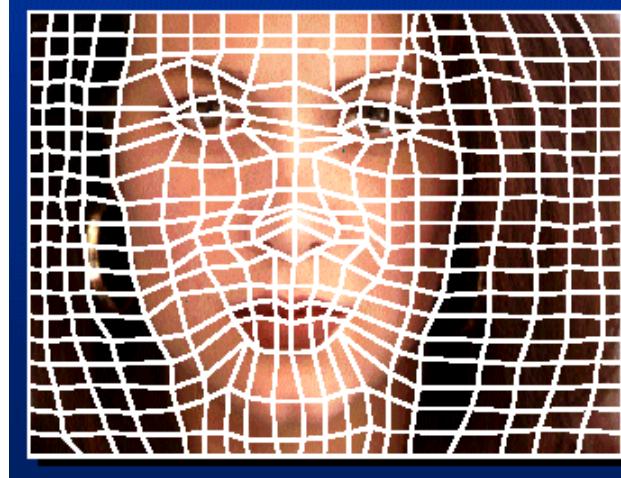


# Warp specification - dense

- How can we specify the warp?

Specify corresponding *spline control points*

- *interpolate* to a complete warping function



But we want to specify only a few points, not a grid

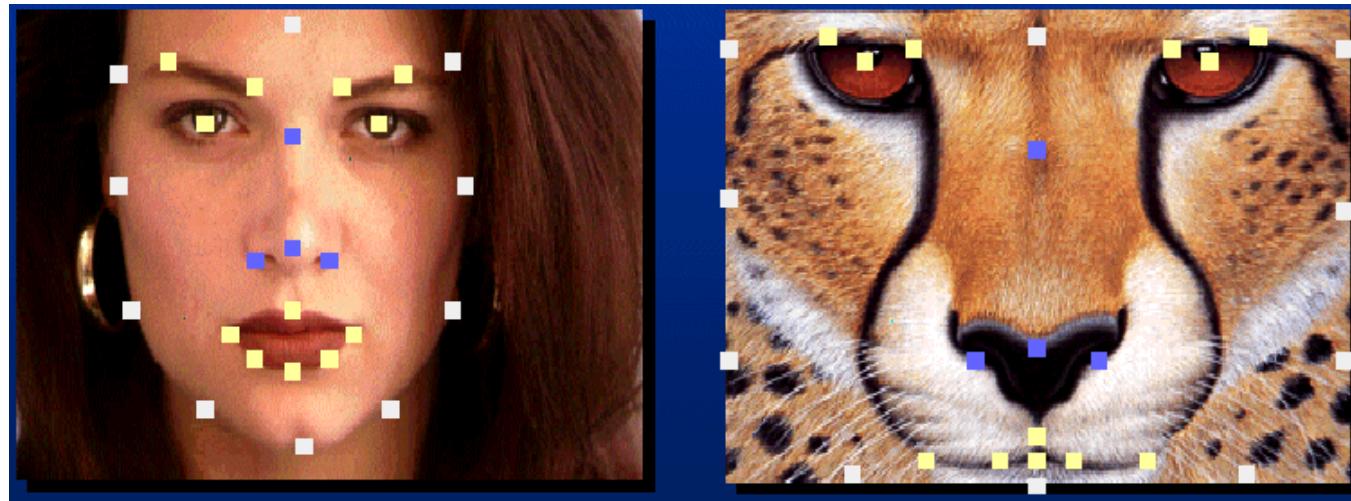
Slide Alyosha Efros

# Warp specification - sparse

- How can we specify the warp?

Specify corresponding *points*

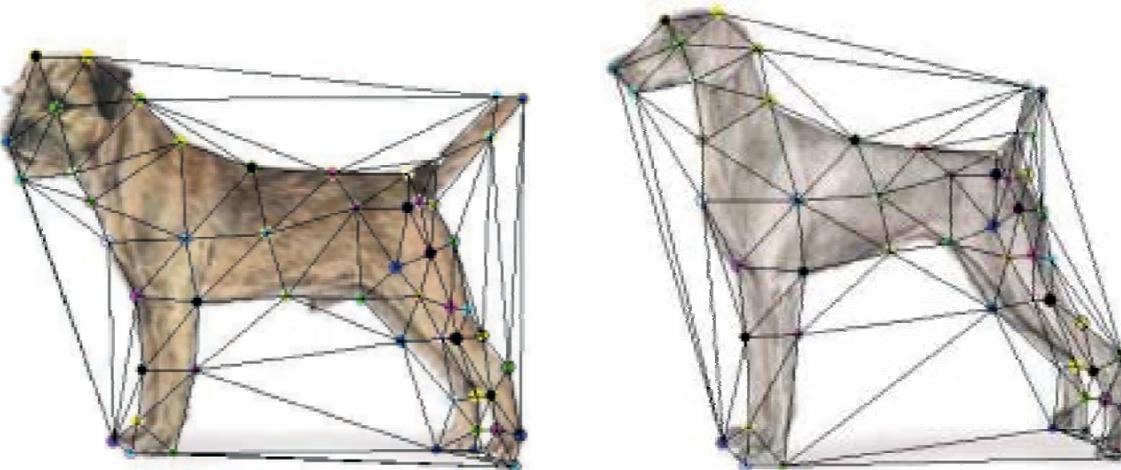
- *interpolate* to a complete warping function
- How do we do it?



How do we go from feature points to pixels?

Slide Alyosha Efros

# Triangular Mesh



- 1. Input correspondences at key feature points**
- 2. Define a triangular mesh over the points**
  - Same mesh in both images!
  - Now we have triangle-to-triangle correspondences
- 3. Warp each triangle separately from source to destination**

# Problems with triangulation morphing

- Not very continuous
  - only  $C^0$

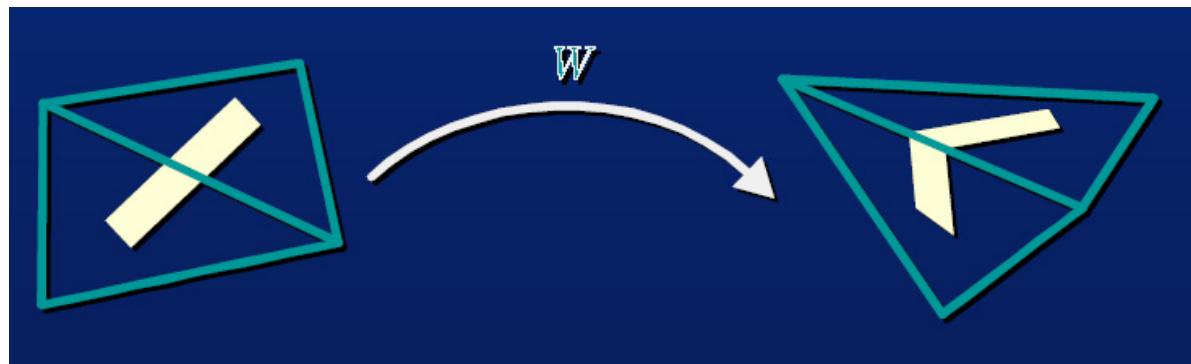
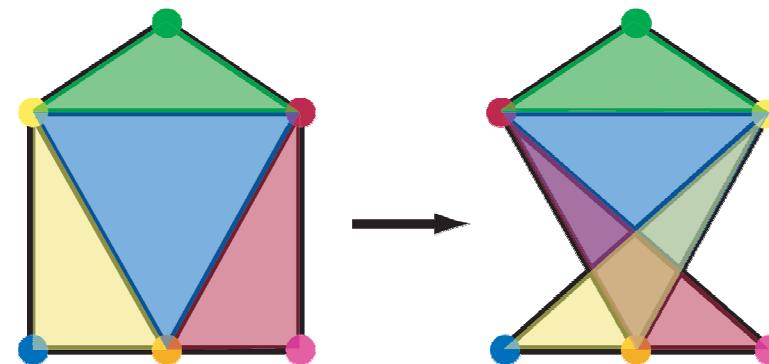


Fig. L. Darsa

- Folding problems



# Warp as interpolation

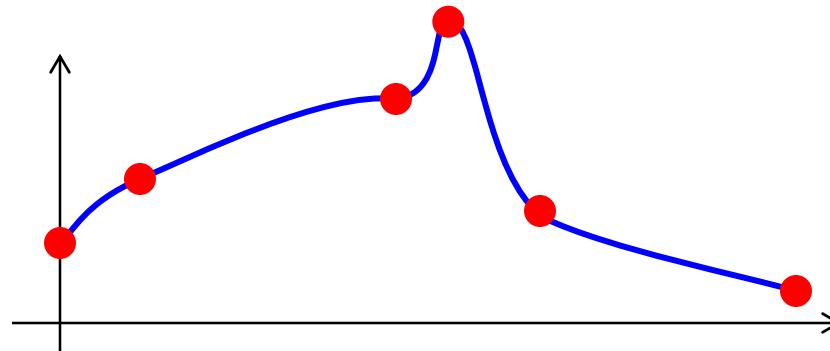
---

- **We are looking for a warping field**
  - A function that given a 2D point, returns a warped 2D point
- **We have a sparse number of correspondences**
  - These specify values of the warping field
- **This is an interpolation problem**
  - Given sparse data, find smooth function

# Interpolation in 1D

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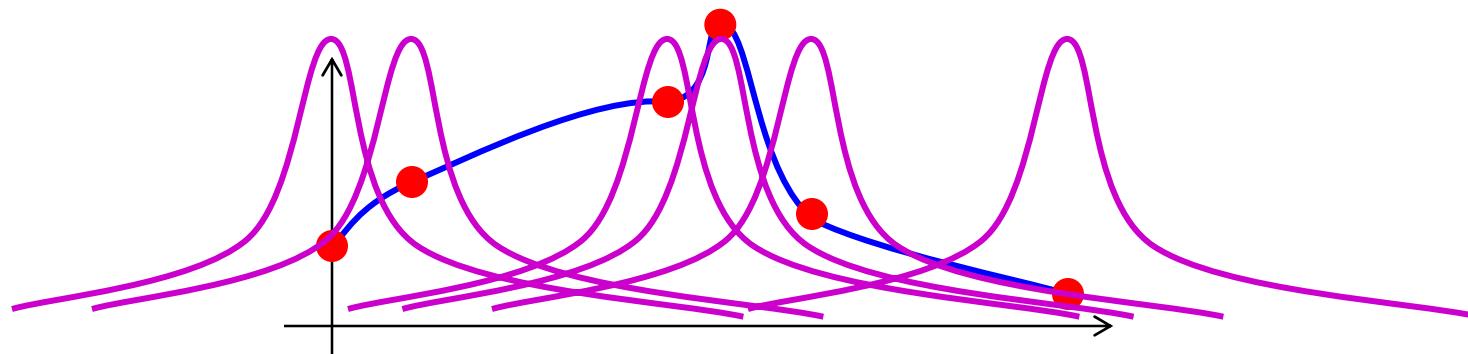
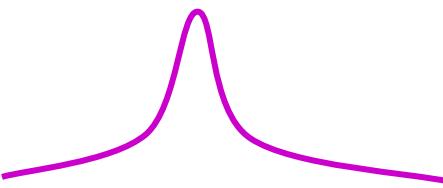
- We are looking for a function  $f$
- We have  $N$  data points:  $x_i, y_i$ 
  - Scattered: spacing between  $x_i$  is non-uniform
- We want  $f$  so that
  - For each  $i$ ,  $f(x_i) = y_i$
  - $f$  is smooth
- Depending on notion of smoothness, different  $f$



# Radial Basis Functions (RBF)

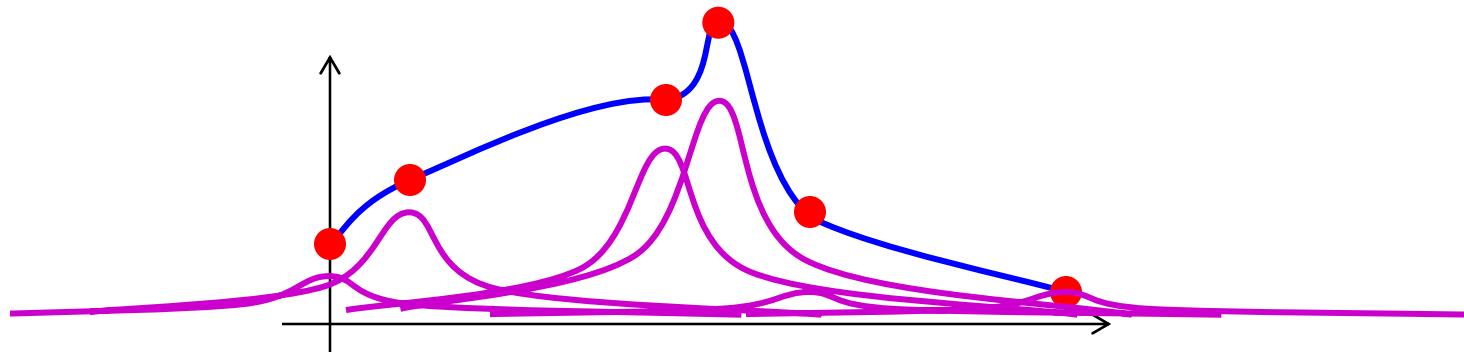
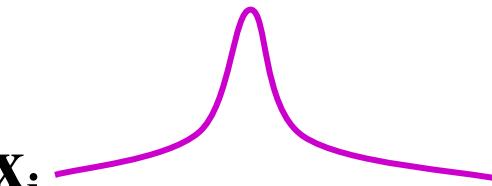
---

- Place a smooth kernel  $R$  centered on each data point  $x_i$
- $f(z) = \sum \alpha_i R(z, x_i)$



# Radial Basis Functions (RBF)

- Place a smooth kernel  $R$  centered on each data point  $x_i$
- $f(z) = \sum \alpha_i R(z, x_i)$
- Find weights  $\alpha_i$  to make sure we interpolate the data  
for each  $i, f(x_i) = y_i$



# Kernel

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- Many choices
- In Assignment 4, we simply use inverse multiquadric

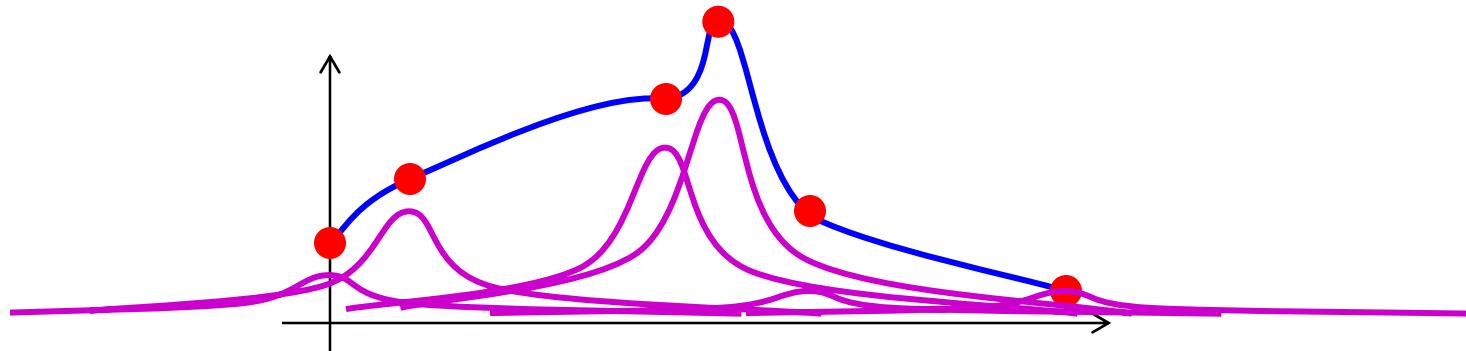
$$R(z, x_i) = \frac{1}{\sqrt{c + \|z - x_i\|^2}}$$

- where  $c$  controls falloff
- Lazy way: set  $c$  to an arbitrary constant (pset 4)
- Smarter way:  $c$  is different for each kernel. For each  $x_i$ , set  $c$  as the squared distance to the closest other  $x_j$

# Enforcing interpolation

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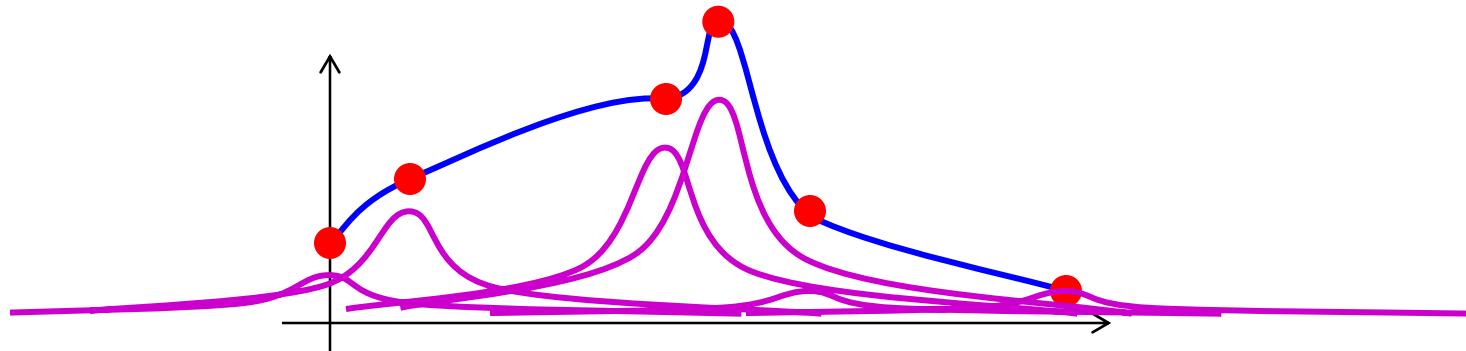
- $f(\mathbf{z}) = \sum \alpha_i R(\mathbf{z}, \mathbf{x}_i)$
- **N equations**  
for each  $j$ ,  $f(\mathbf{x}_j) = y_j$   
 $\sum \alpha_i R(\mathbf{x}_j, \mathbf{x}_i) = y_j$
- **N unknowns**  $\alpha_i$
- **Just inverse the matrix**



# Important note

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- $f(\mathbf{z}) = \sum \alpha_i R(\mathbf{z}, \mathbf{x}_i)$   
for each  $j$ ,  $\sum \alpha_i R(\mathbf{x}_j, \mathbf{x}_i) = y_j$
- Note that  
**the influence of each function is non-zero everywhere at a data point, the value of the other bases is not zero**
- In contrast to e.g. various interpolation splines



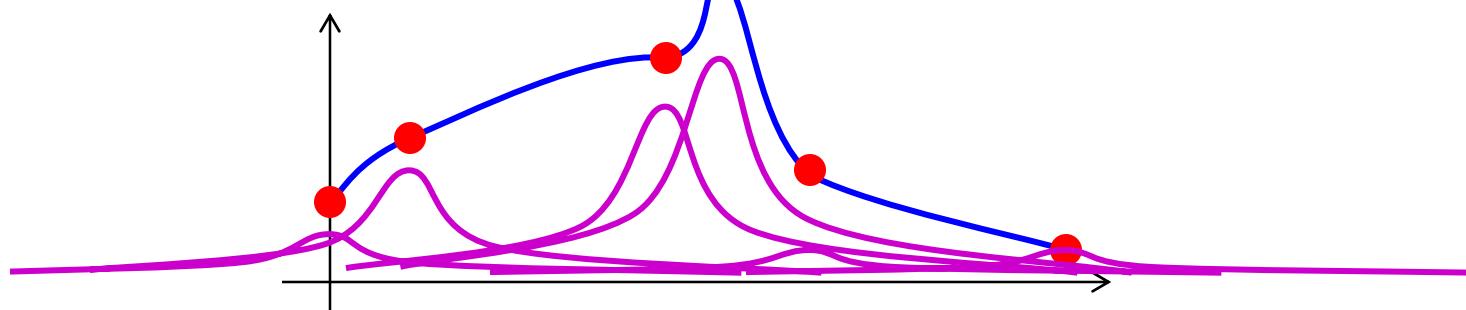
# Variations of RBF

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- Lots of possible kernels
  - Gaussians  $e^{-r^2/2\sigma}$
  - Thin-plate splines  $r^2 \log r$
- Sometimes add a global polynomial term

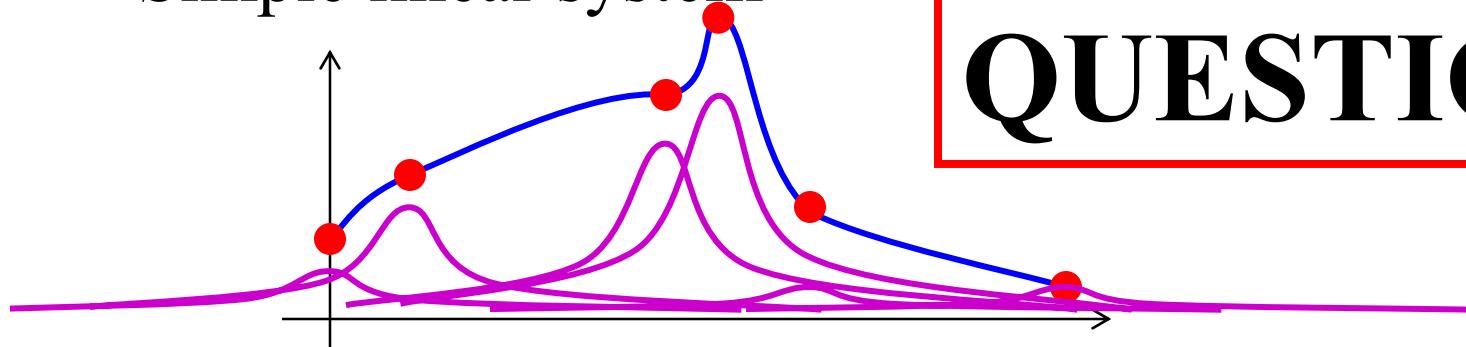
# Recap: 1D scattered data interpolation

- Sparse input/output pairs  $x_i, y_i$ 
  - non-uniformly sampled
- **RBFs (Radial Basis Functions)**
  - Weighted sum of kernels  $R$  centered on data points  $x_i$
  - $$f(z) = \sum \alpha_i R(z, x_i)$$
  - Compute the weights  $\alpha_i$  by enforcing interpolation  
 $f(x_j) = y_j$
  - Simple linear system



# Recap: 1D scattered data interpolation

- Sparse input/output pairs  $x_i, y_i$ 
  - non-uniformly sampled
- RBFs (Radial Basis Functions)
  - Weighted sum of kernels  $R$  centered on data points  $x_i$
  - $$f(z) = \sum \alpha_i R(z, x_i)$$
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 $f(x_j) = y_j$
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QUESTION?

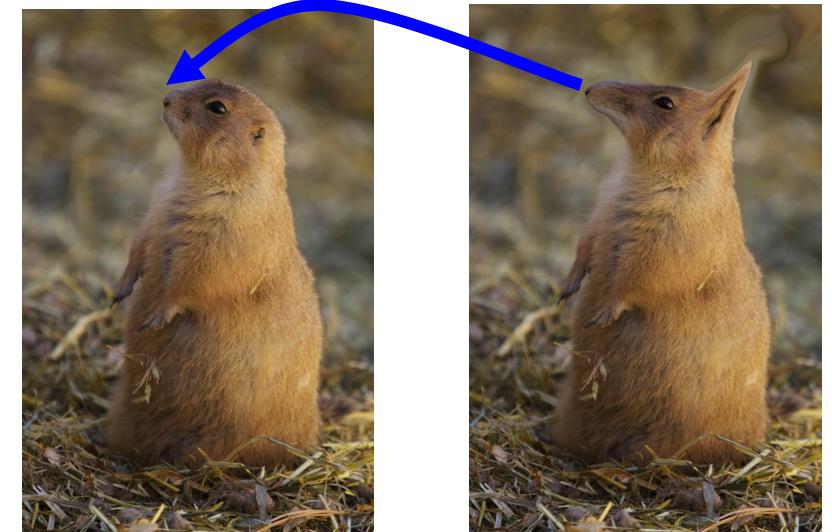
# RBF for warping: 2D case

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- Instead of  $f: \mathbf{R} \rightarrow \mathbf{R}$ , we now deal with  $f: \mathbf{R}^2 \rightarrow \mathbf{R}^2$ 
  - For each 2D point,  $f$  gives us another 2D warped point
- We have  $N$  data points
  - Pairs of input 2D vector, output 2D vector
  - Careful:  $x_i$  is now a 2D vector, so is  $y_i$
  - Don't be confused with coordinates  $(x, y)$
- Place 2D kernels at each data point
- The weights  $\alpha_i$  are now 2D vectors
- Solve a linear system of  $2N$  equations and  $2N$  unknowns

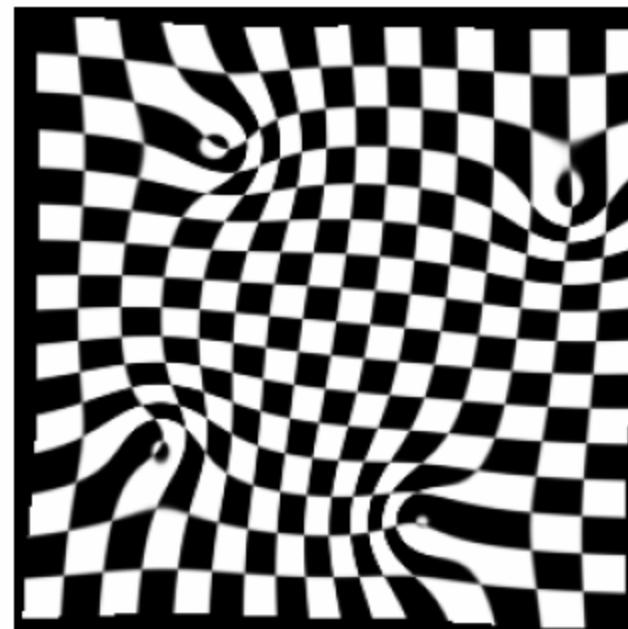
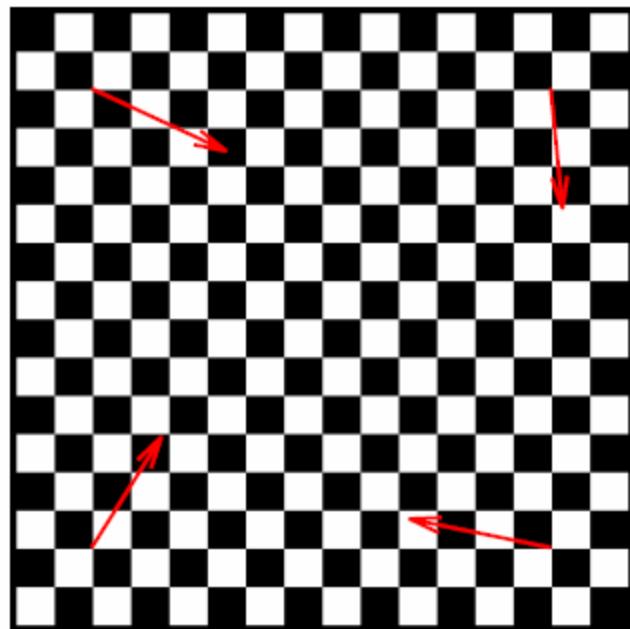
# Applying a warp: USE INVERSE

- **Forward warp:**
  - For each pixel in **input** image
    - Paste color **to warped** location in output
  - Problem: gaps
- **Inverse warp**
  - For each pixel in **output** image
    - Lookup color **from inverse-warped** location



# Example

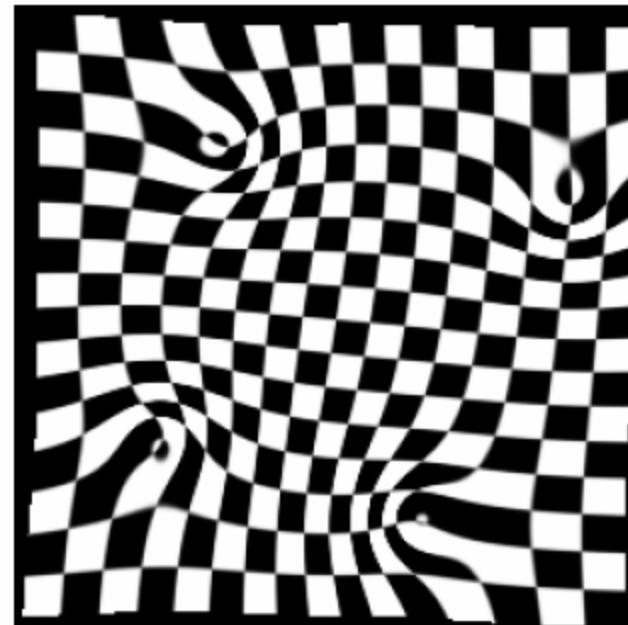
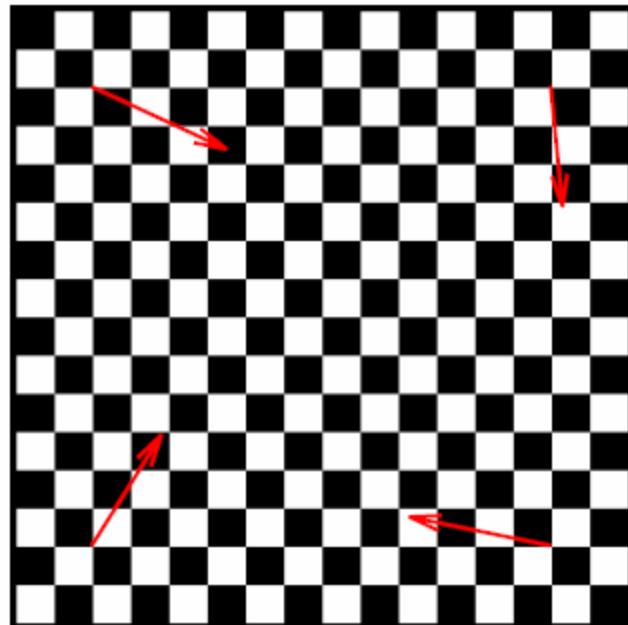
---



# Example

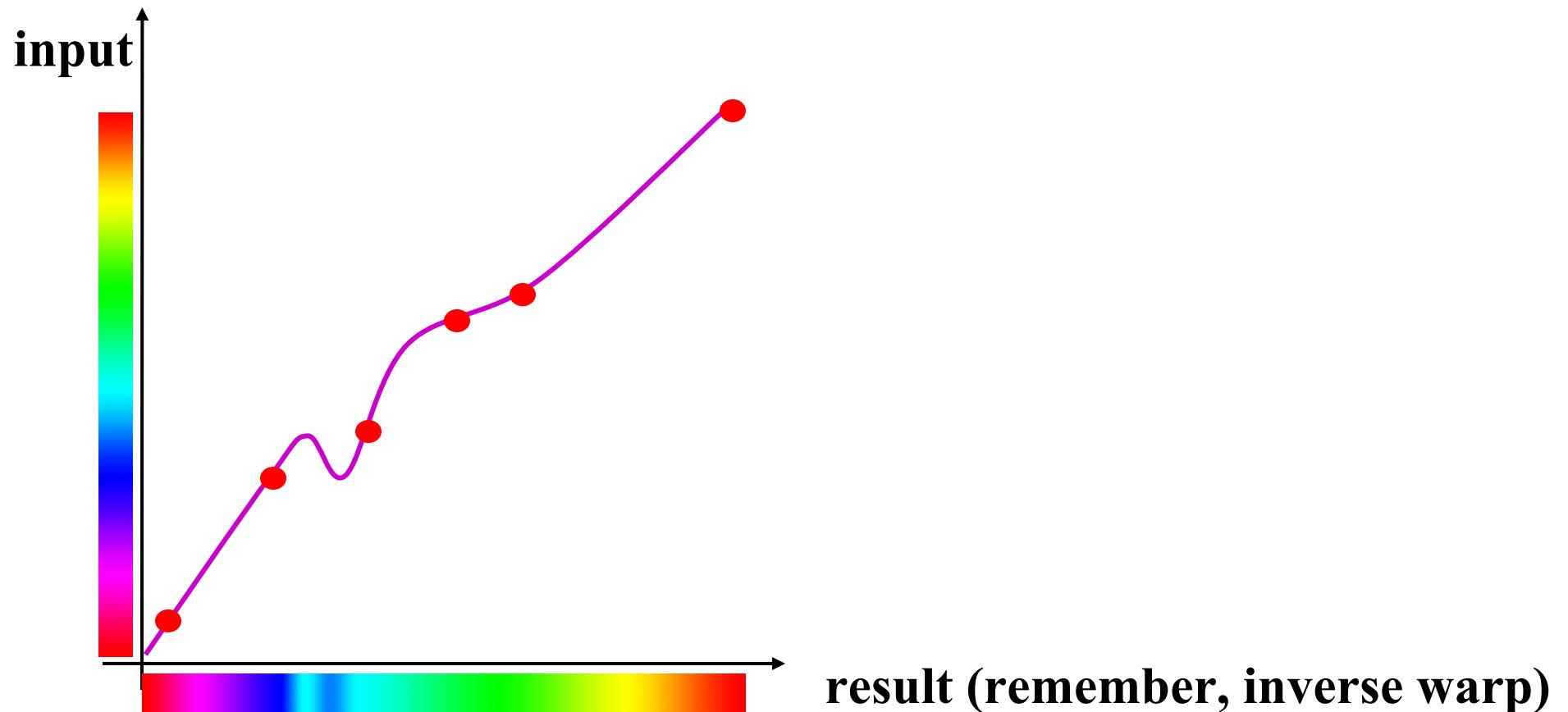
---

- Fold problems
  - Oh well...



# 1D equivalent of folds

- There is no guarantee that our 1D RBF is monotonic
- Yes, it means that the notion of inverse of the warp is questionable.



# Hardcore Photoshop for portrait





**figure 9.37**

Selecting the entire left side of the image avoids potential artifacts.



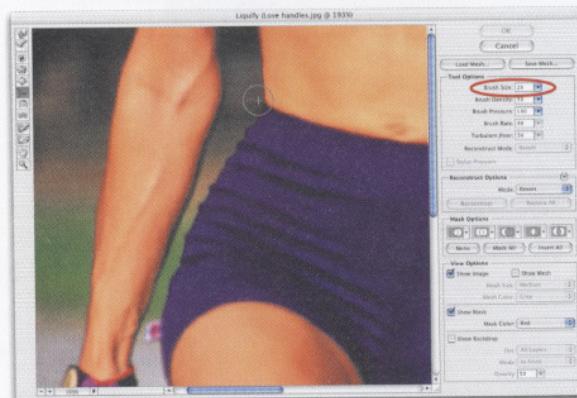
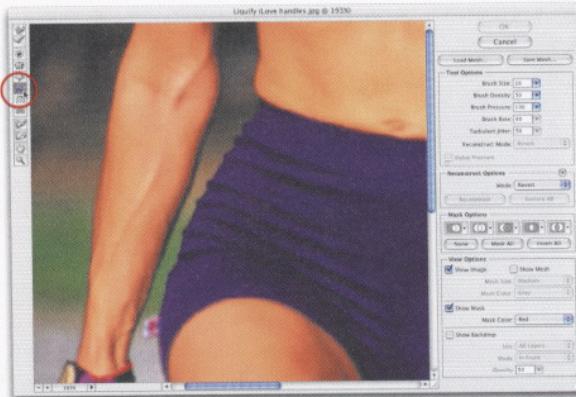
**figure 9.38**

Dragging a Free Transform handle to narrow the selected area.



**figure 9.39**

The Liquify filter's Warp tool pushes pixels forward as you drag.

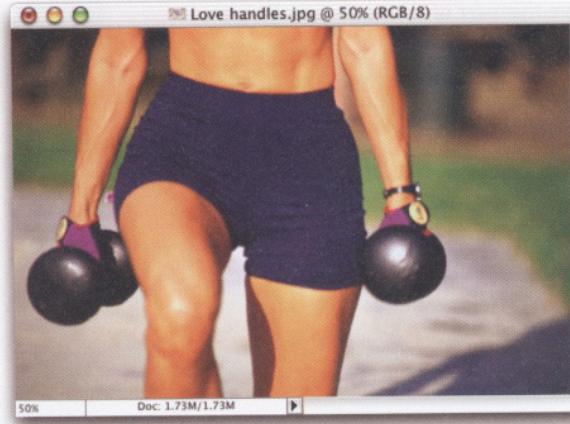
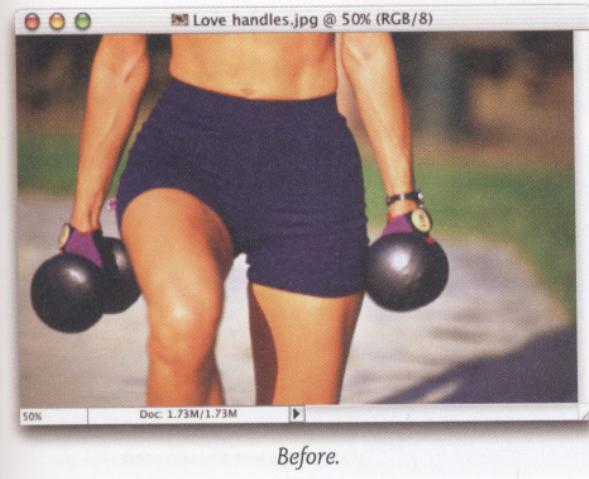


### Step Three:

Get the Push Left tool from the Toolbar (as shown here). It was called the Shift Pixels tool in Photoshop 6 and 7, but Adobe realized that you were getting used to the name, so they changed it, just to keep you off balance.

### Step Four:

Choose a relatively small brush size (like the one shown here) using the Brush Size field near the top-right of the Liquify dialog. With it, paint a downward stroke starting just above and outside the love handle and continuing downward. The pixels shift back in toward the body, removing the love handle as you paint. (Note: If you need to remove love handles on the left side of the body, paint upward rather than downward. Why? That's just the way it works.) When you click OK, the love handle repair is complete.



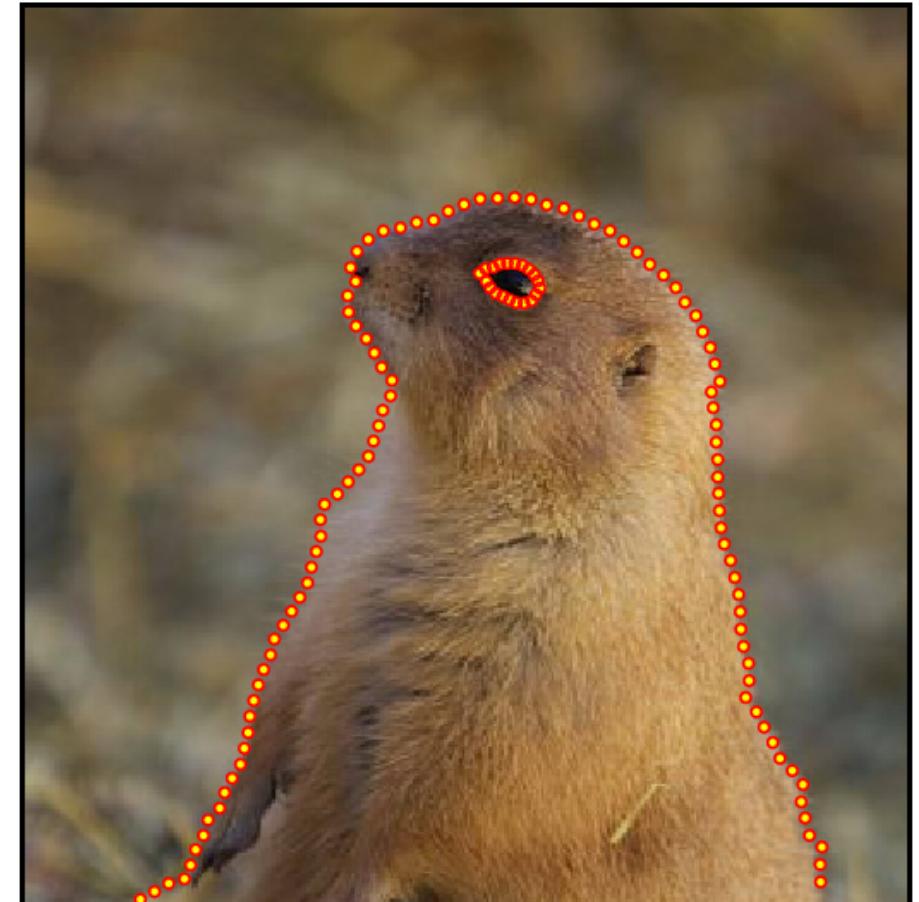
# Morphing

# Input images

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# Feature correspondences

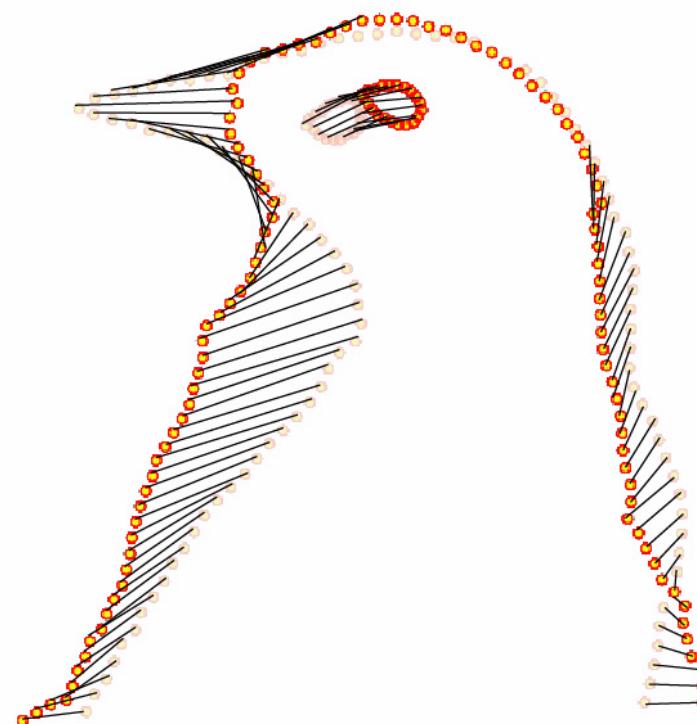


- The feature locations will be our  $y_i$

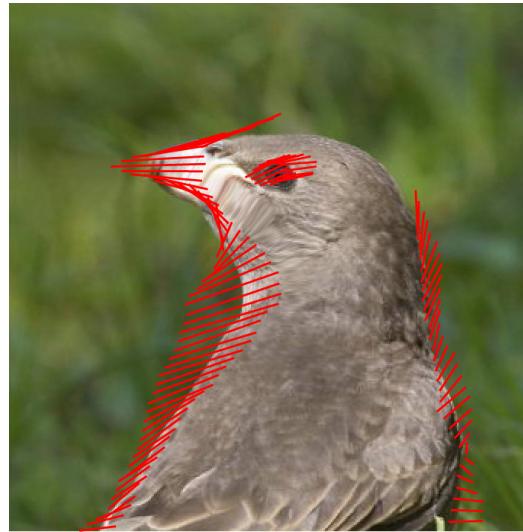
# Interpolate feature location

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- Provides the  $x_i$



# Warp each image to intermediate location

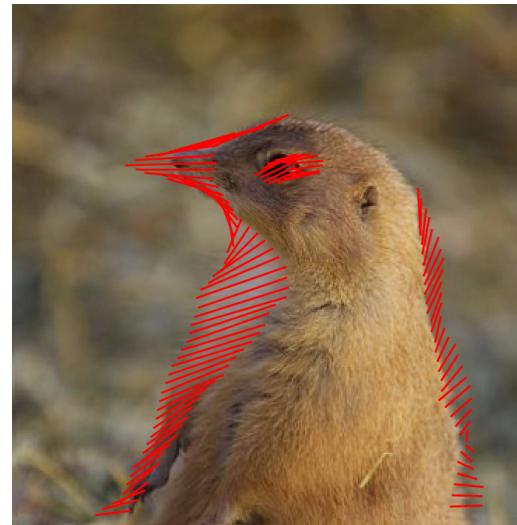


**Two different warps:  
Same target location,  
different source location**

i.e. the  $x_i$  are the same  
(intermediate locations),  
the  $y_i$  are different (source  
feature locations)

**Note: the  $y_i$  do not change  
along the animation, but  
the  $x_i$  are different for  
each intermediate image**

**Here we show  $t=0.5$   
(the  $y_i$  are in the middle)**

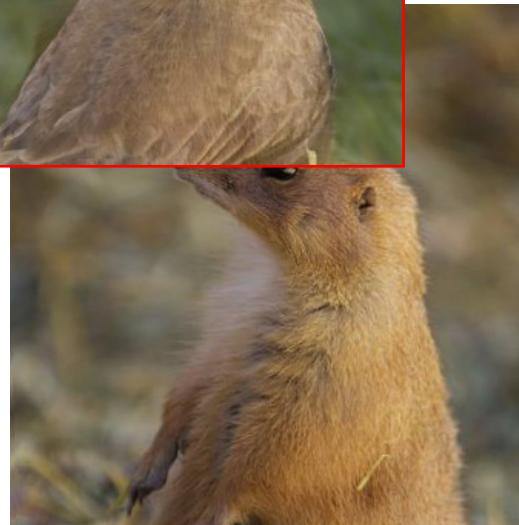
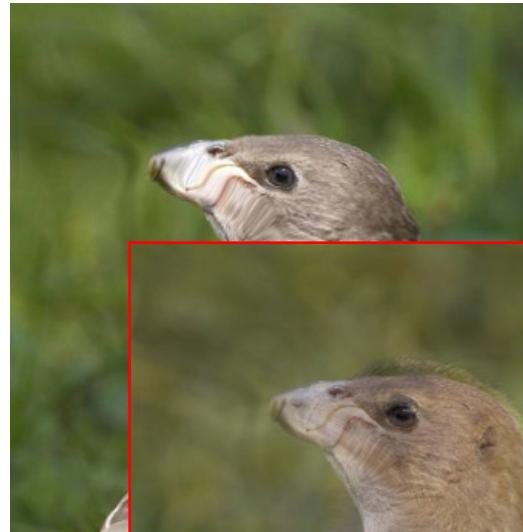


# Warp each image to intermediate location

---



# Interpolate colors linearly



Interpolation weight are a function of time:

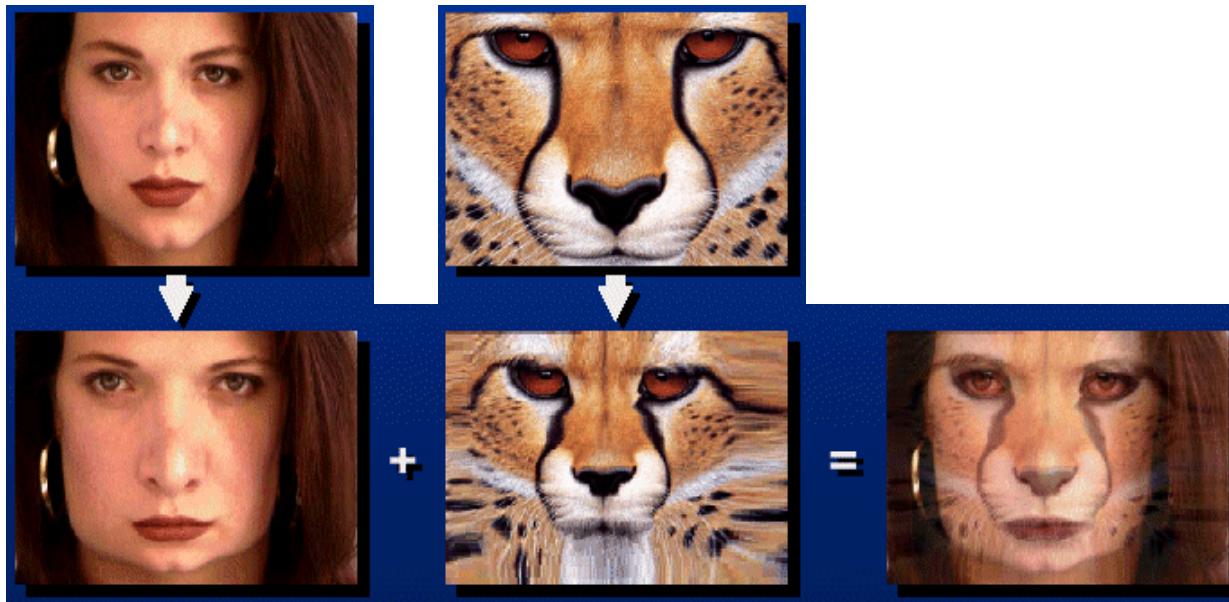
$$C =$$

$$(1-t)f^0_t(I_0) + t f^1_t(I_1)$$

# Recap

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- For each intermediate frame  $I_t$ 
  - Interpolate feature locations  $y_i^t = (1 - t) x_i^0 + t x_i^1$
  - Perform **two** warps: one for  $I_0$ , one for  $I_1$ 
    - Deduce a dense warp field from the pairs of features
    - Warp the pixels
  - Linearly interpolate the two warped images





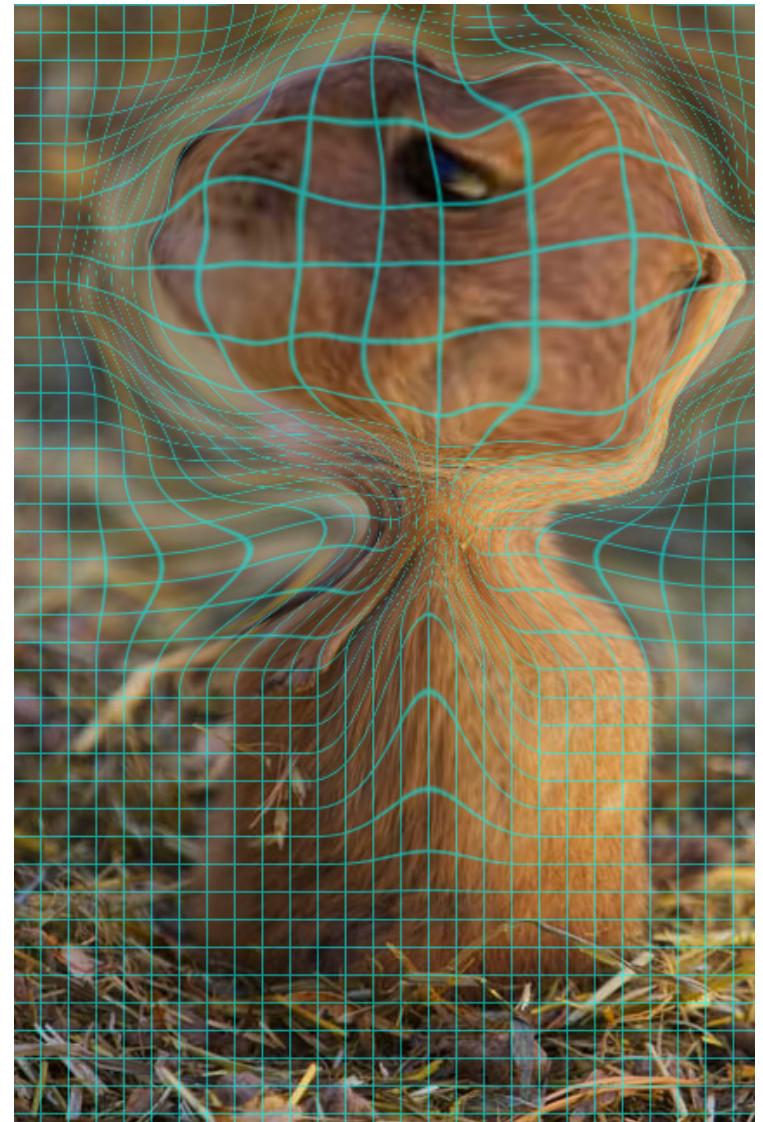
# Movie time

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# Resampling

# The sampling problem

- Parts are magnified
  - Parts are minified
  - Sometimes anisotropic
- 
- Same problem for 3D texture mapping



# Intuition

**Plain lookup is bad**

(But good news: that's all we ask for pset 4)

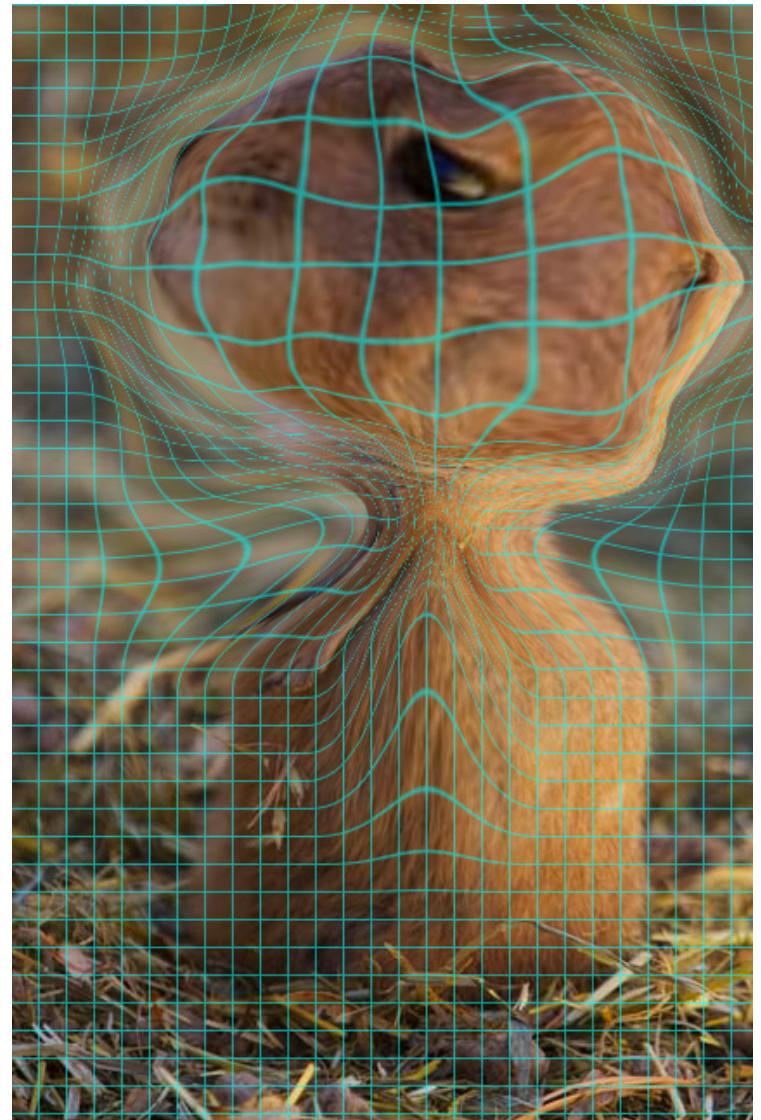
- **In magnified regions, not smooth enough**
- **In minified regions, it creates aliasing**

**What we want**

In magnified regions, smooth interpolation

In minified regions, take the average

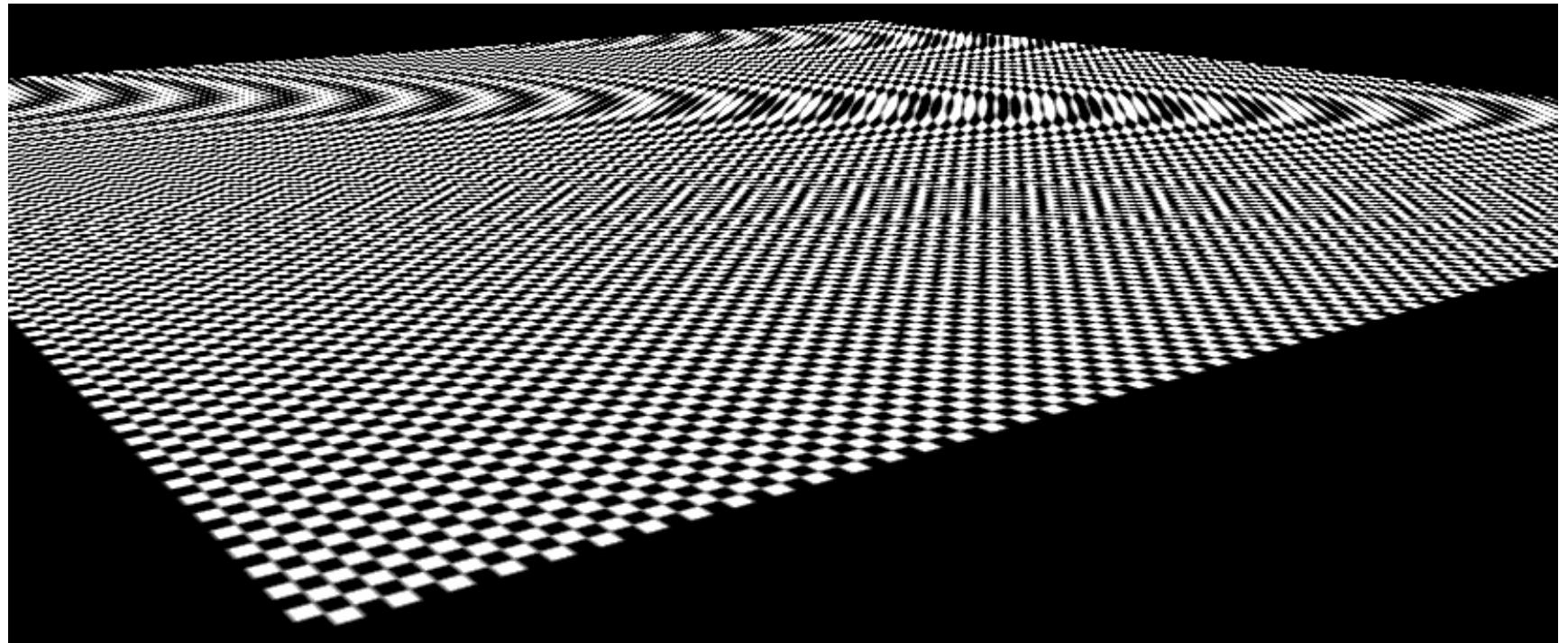
**We need good signal processing framework to do this**



# Similar case: texture aliasing

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- *Aliasing* is the under-sampling of a signal, and it's especially noticeable during animation





# The Bible

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- <http://www-2.cs.cmu.edu/~ph/texfund/texfund.pdf>

Fundamentals of Texture Mapping and Image Warping

*Master's Thesis*  
under the direction of Carlo Séquin

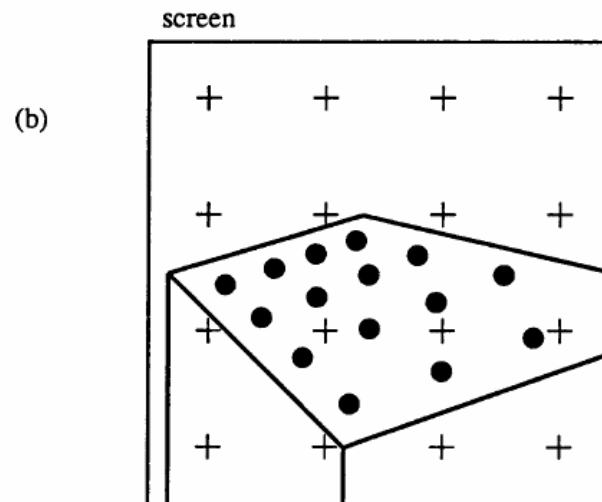
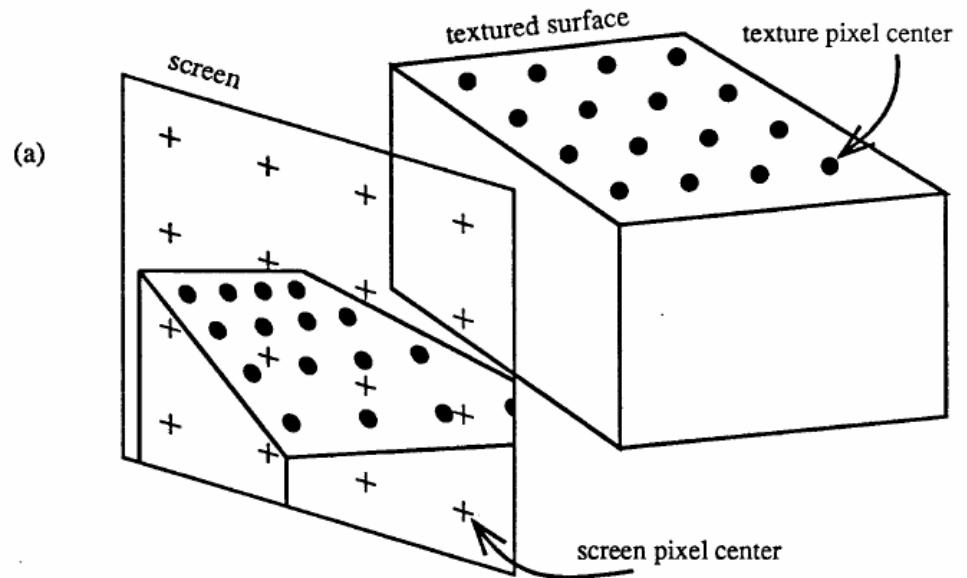
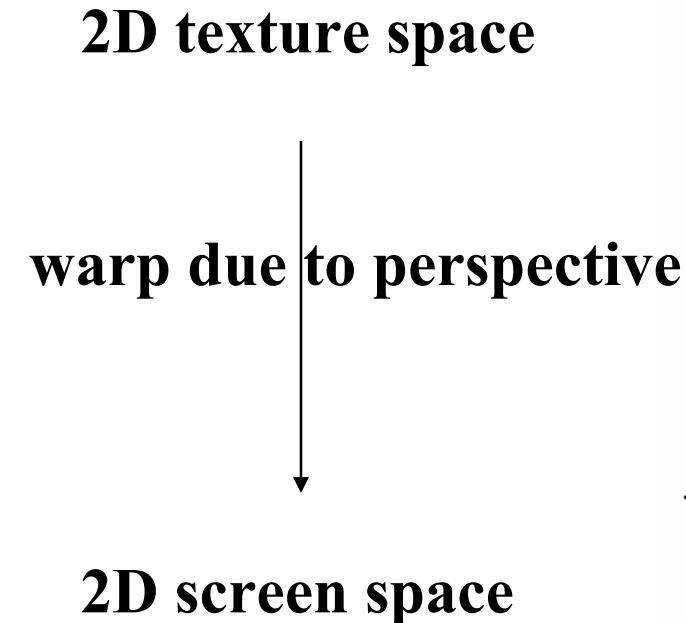
Paul S. Heckbert

Dept. of Electrical Engineering and Computer Science  
University of California, Berkeley, CA 94720

©1989 Paul S. Heckbert

June 17, 1989

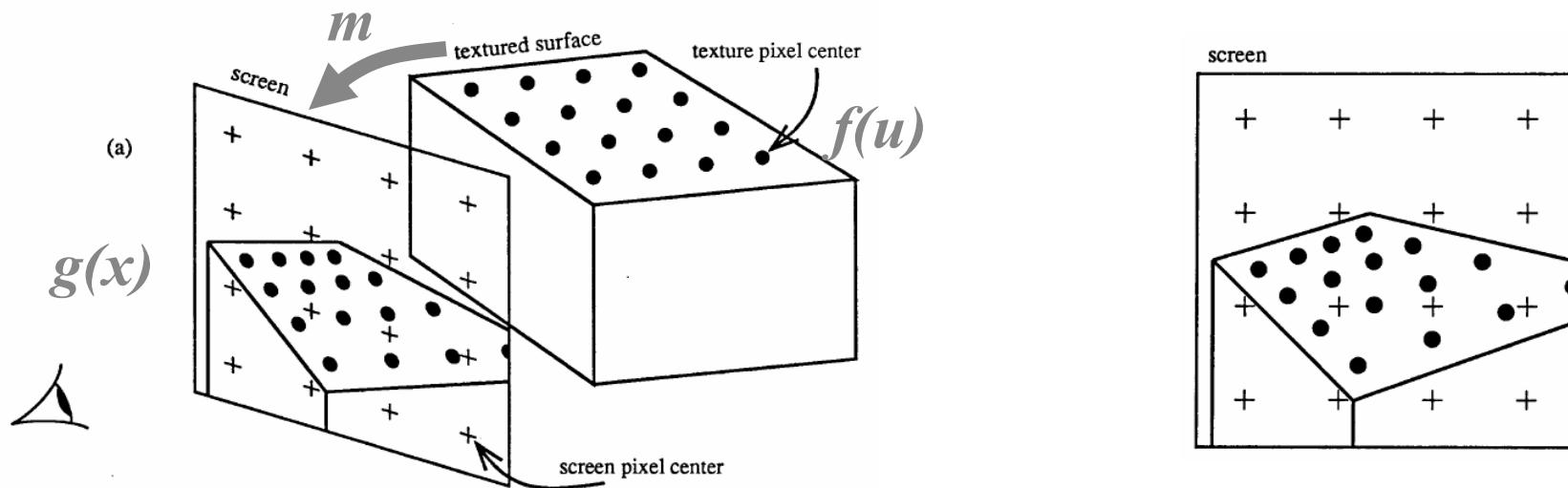
# Resampling



# Notations

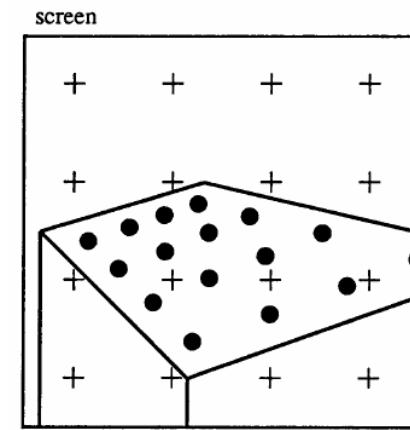
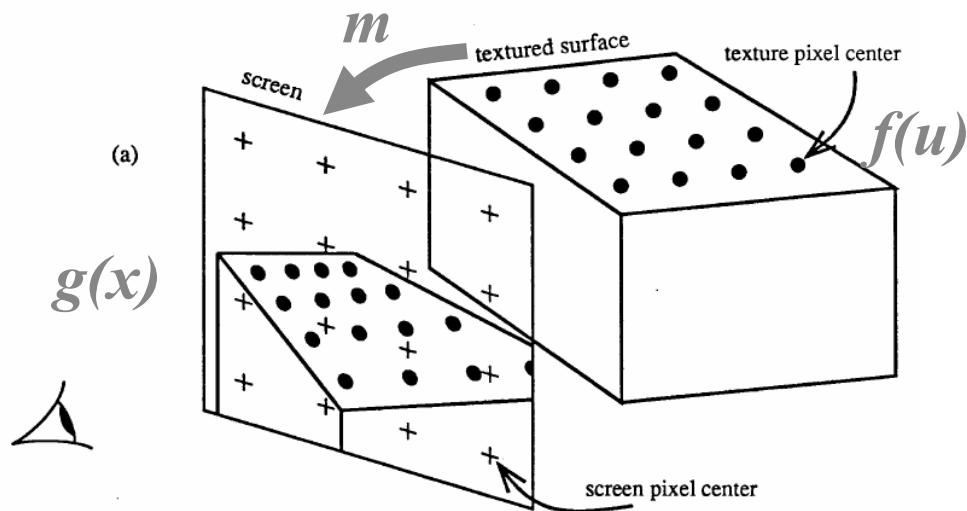
- Input signal  $f(u)$
- Forward mapping (texture-to-screen)  $x=m(u)$
- Output signal  $g(x)$

Warning: I sloppily changed my notations:  
 $f$  is signal, warp is  $m$



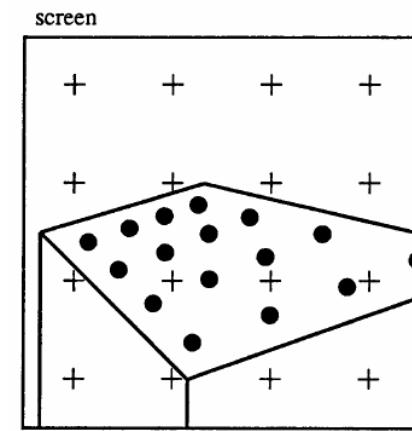
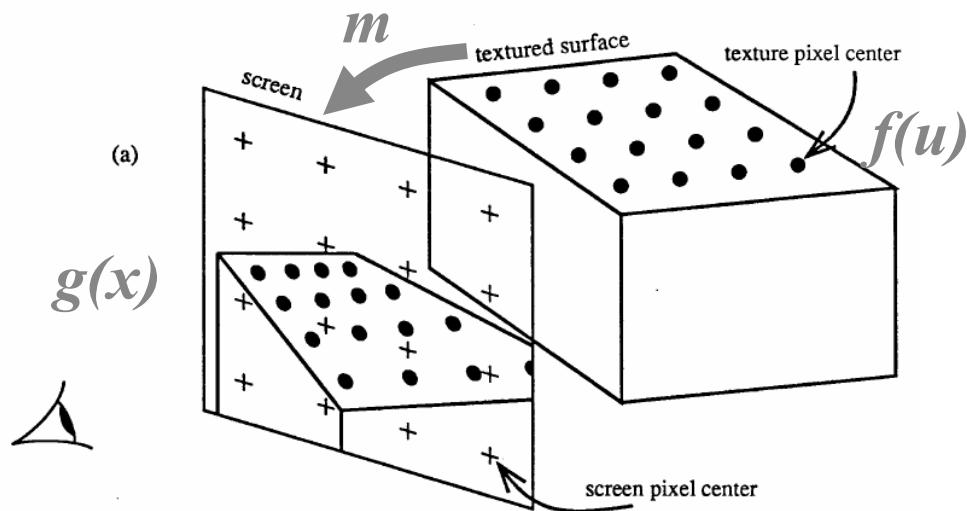
# Resampling

- What do we need to do?



# Resampling

1. Reconstruct the continuous signal from the discrete input signal
2. Warp the domain of the continuous signal
3. Prefilter the warped continuous signal
4. Sample this signal



# Resampling

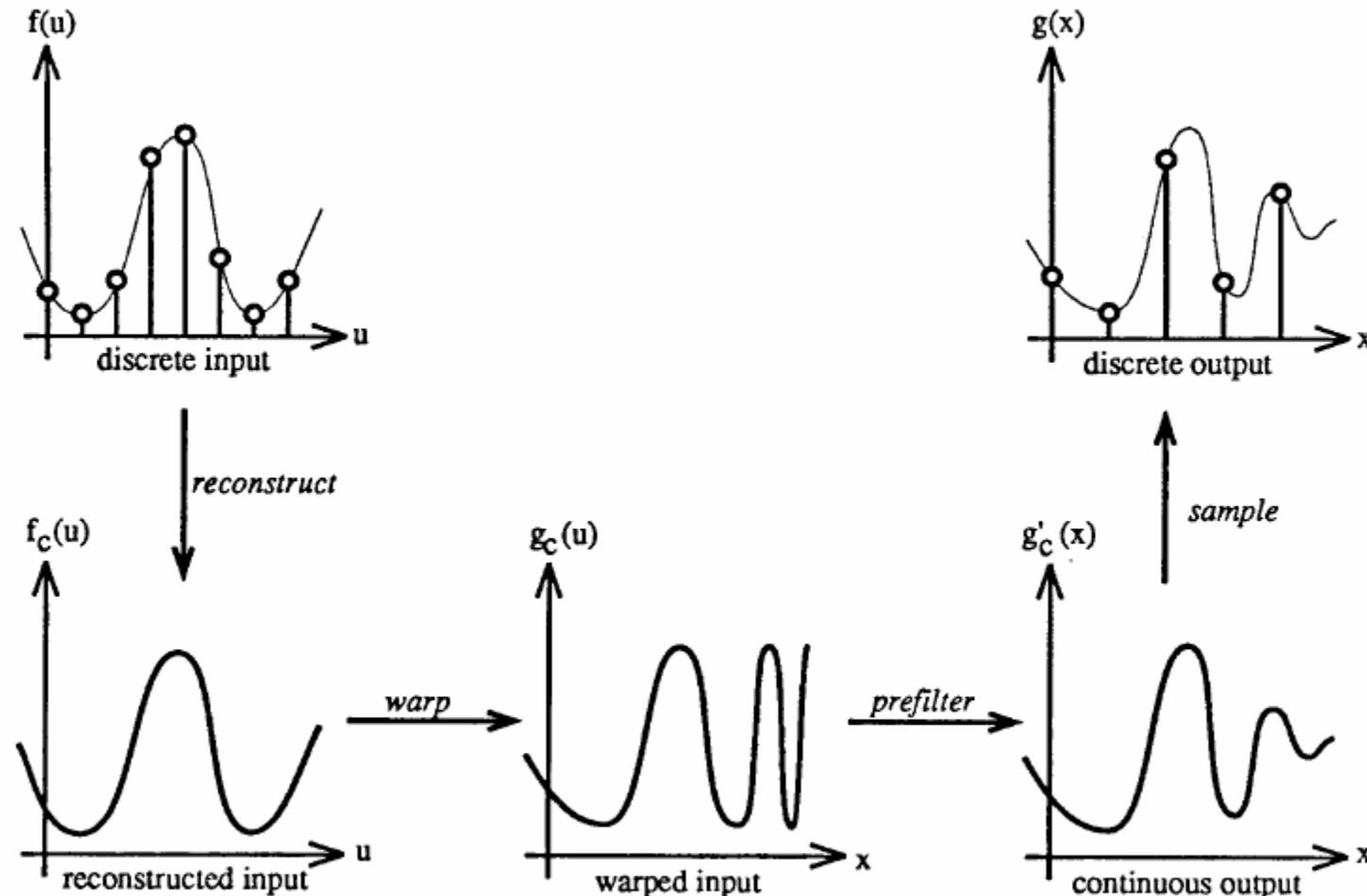
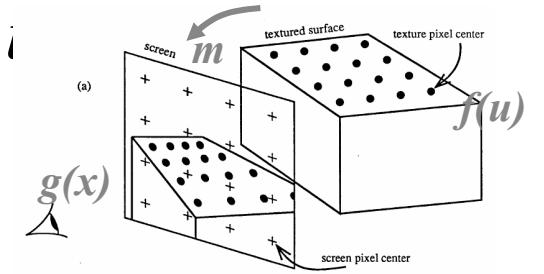
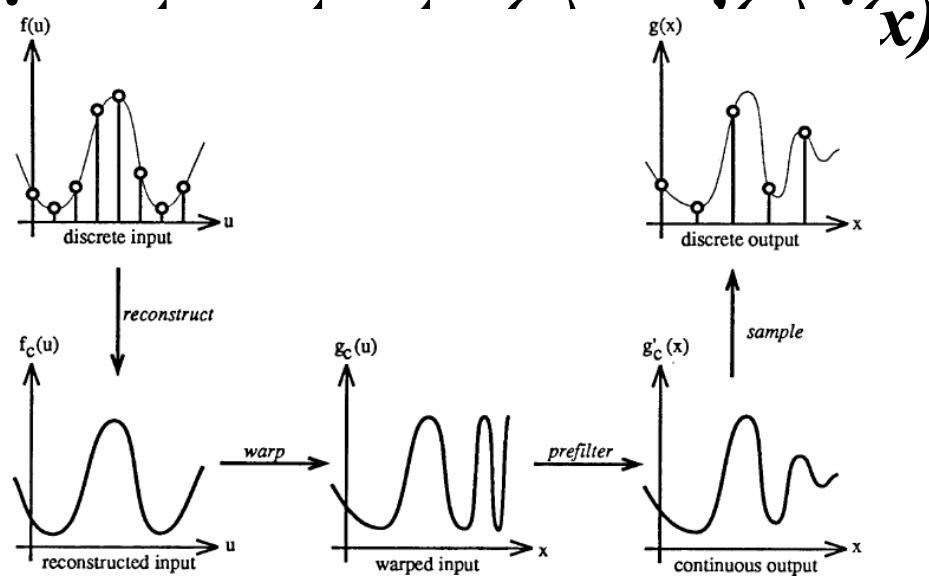


Figure 3.11: *The four steps of ideal resampling: reconstruction, warp, prefilter, and sample.*

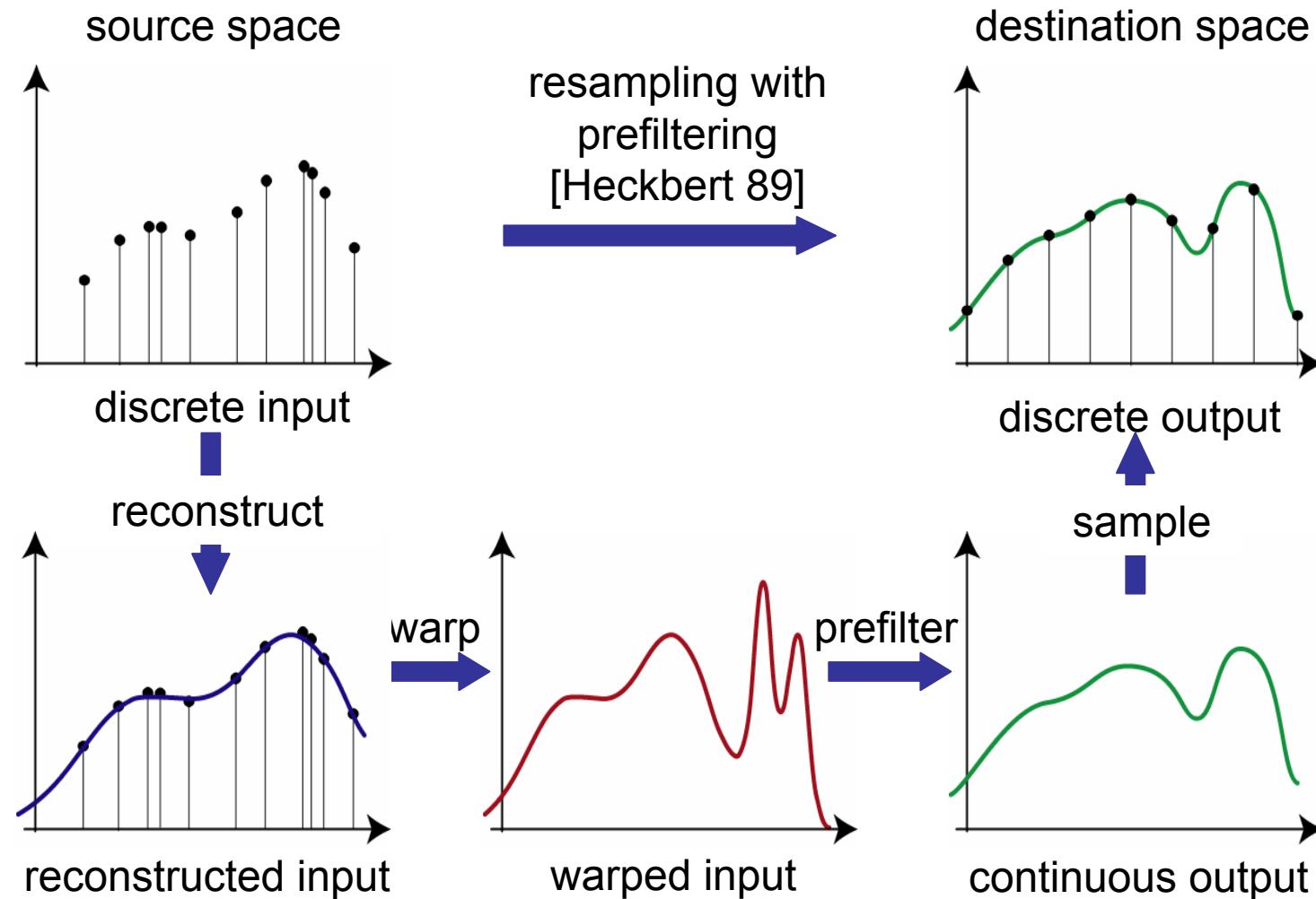
# Resampling: progression

- Discrete input texture  $f(u)$  for integer  $i$
- Reconstructed input texture  

$$f_c(u) = f(u) \otimes r(u) = \sum f(k) r(u-k)$$
- Warped texture  $g_c(x) = f_c(m^{-1}(x))$
- Band-limited output  $g'_c(x) = g_c(x) \otimes h(x) = \int g_c(t) h(x-t) dt$
- $\Gamma$



# Resampling



# Put it together

---

- Discrete input texture  $f(u)$  for integer  $u$
- Reconstructed input texture  $f_c(u) = f(u) \otimes r(u) = \sum f(k) r(u-k)$
- Warped texture  $g_c(x) = f_c(m^{-1}(x))$
- Band-limited output  $g'_c(x) = g_c(x) h(x) = \int g_c(t) h(x-t) dt$
- Discrete output  $g(x) = g'(x) \otimes i(x)$
- $g(x) = g'_c(x)$

# Put it together

---

- Discrete input texture  $f(u)$  for integer  $u$
- Reconstructed input texture  $f_c(u) = f(u) \otimes r(u) = \sum f(k) r(u-k)$
- Warped texture  $g_c(x) = f_c(m^{-1}(x))$
- Band-limited output  $g'_c(x) = g_c(x) h(x) = \int g_c(t) h(x-t) dt$
- Discrete output  $g(x) = g'(x) \otimes i(x)$
- $$\begin{aligned} g(x) &= g'_c(x) \\ &= \int g_c(t) h(x-t) dt \\ &= \int f_c(m^{-1}(t)) h(x-t) dt \\ &= \int h(x-t) \sum f(k) r(m^{-1}(t)-k) dt \\ &= \sum f(k) \rho(x, k) \end{aligned}$$
- Where  $\rho(x, k) = \int h(x - t) r(m^{-1}(t) - k) dt$

# Resampling – convolution view

---

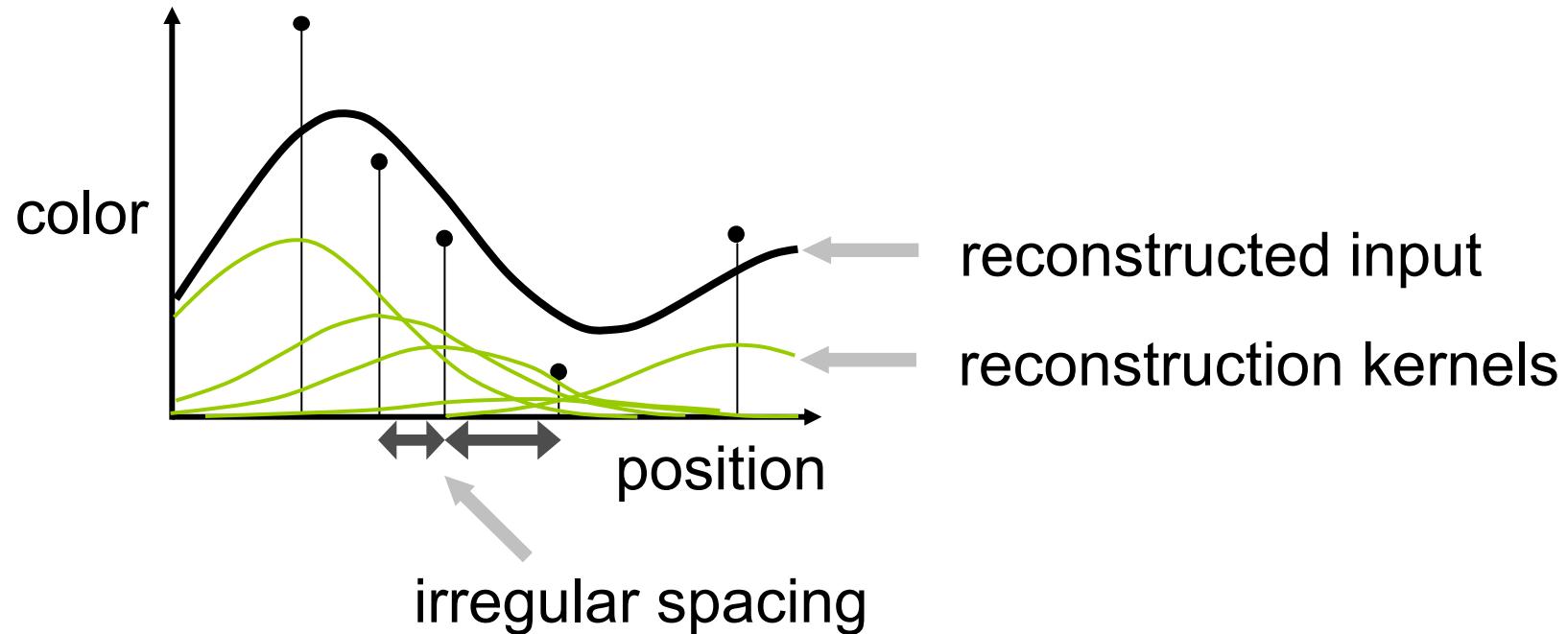
- Ignoring normalization

$$g(x) = \sum_i f(x_i) r_i(m^{-1}(x)) \otimes h(x)$$

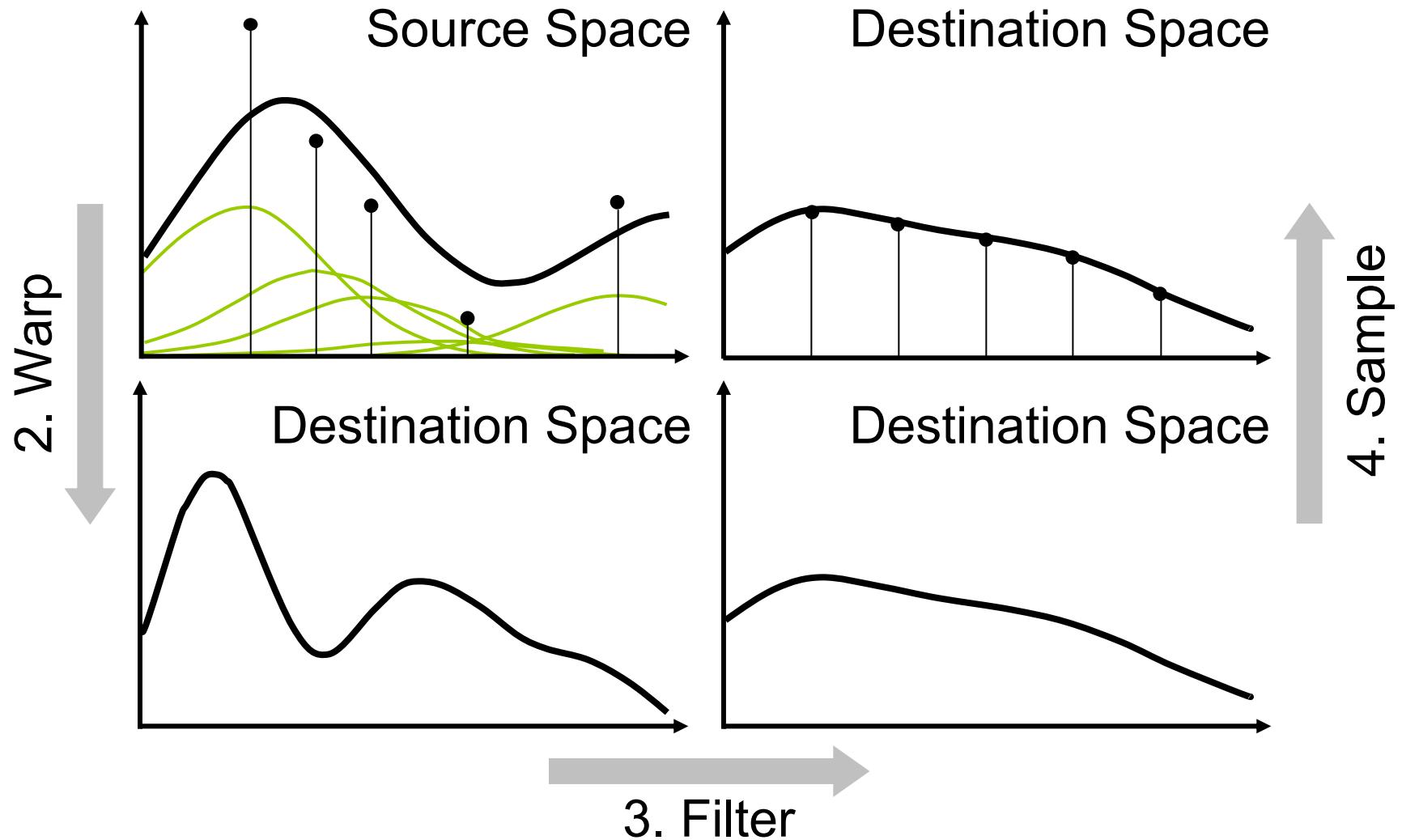
resampling filter

- The image space resampling filter combines a warped reconstruction filter and a low-pass filter

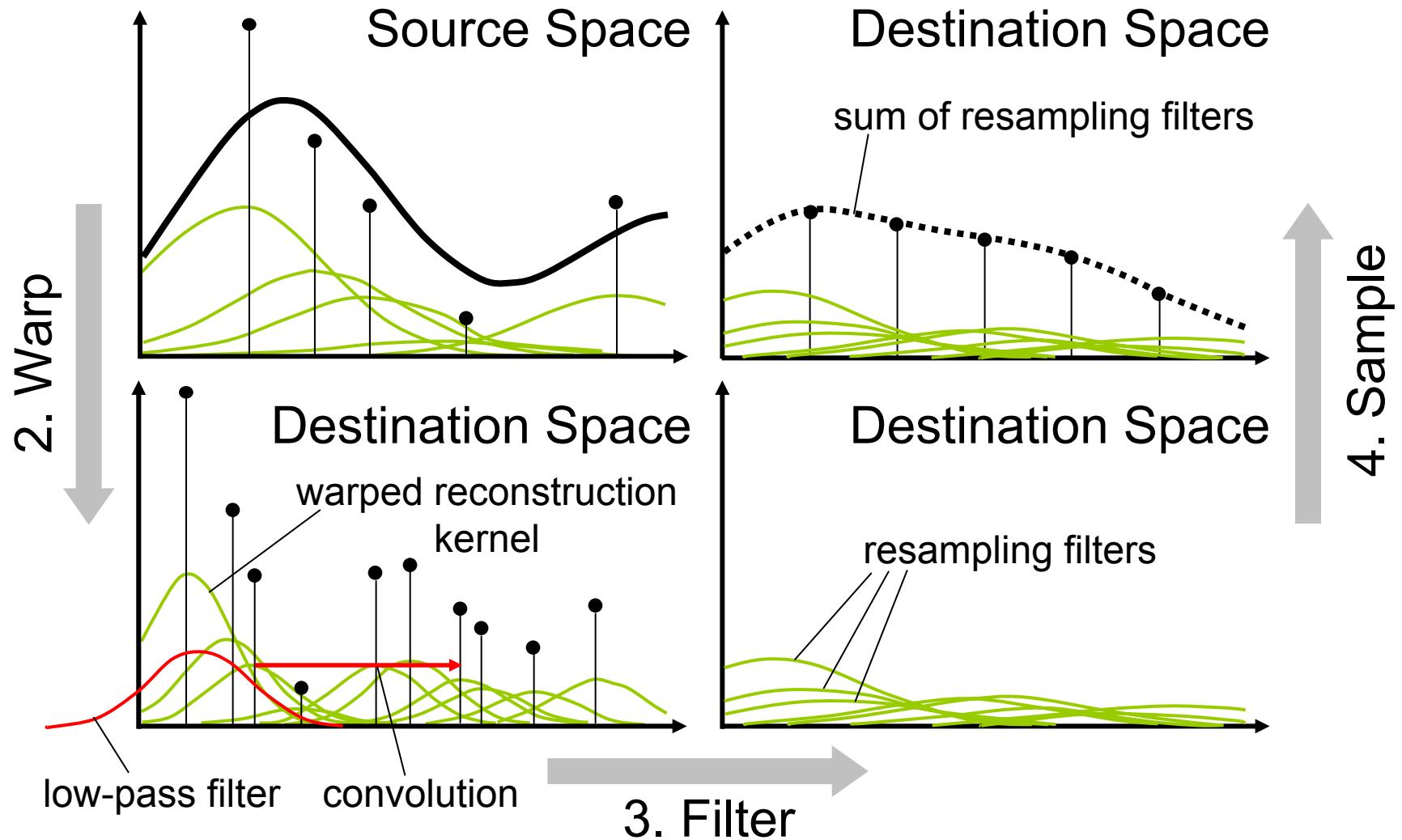
# Resampling



# Resampling



# Resampling



# Resampling – convolution view

---

- Ignoring normalization

$$g(x) = \sum_i f(x_i) r_i(m^{-1}(x)) \otimes h(x)$$

resampling filter

- The image space resampling filter combines a warped reconstruction filter and a low-pass filter
- *This is great, but how do we warp reconstruction filters?*

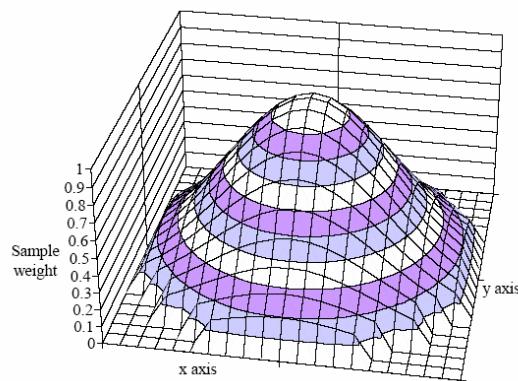
# Resampling

---

- Use local affine approximation of warp
- Elliptical Gaussian kernels [Heckbert 89]
  - Closed under affine mappings and convolution

$$g(x) = \sum_i c_i r_i(\tilde{m}_i^{-1}(x)) \otimes h(x)$$

$$= \sum_i c_i G_i(x)$$



Gaussian resampling kernel  
(EWA resampling kernel)

# Resampling filter

- Depends on local warp
- For perspective,  
approximated by local affine at  
center of kernel
- Not bad approximation because  
filter small at periphery

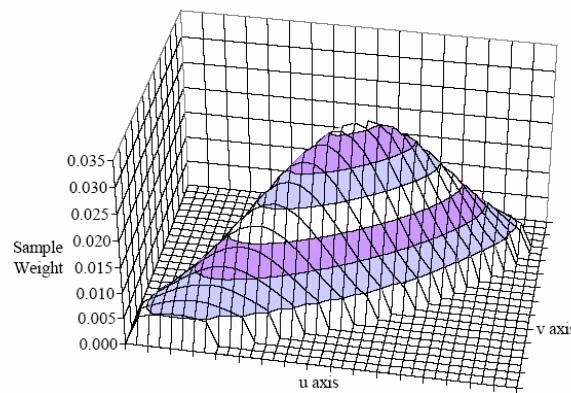
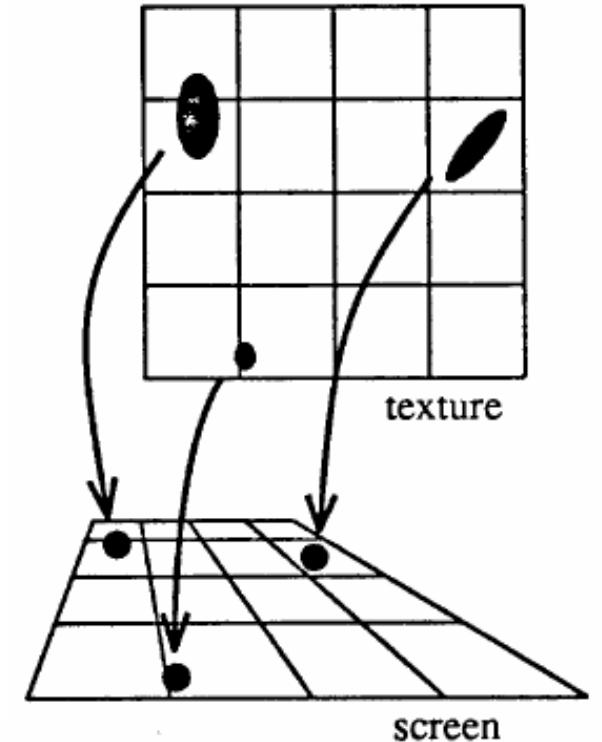


Figure 3: A perspective projection of a Gaussian filter into texture space.

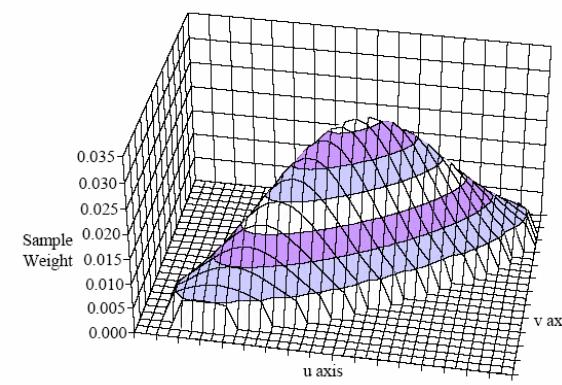
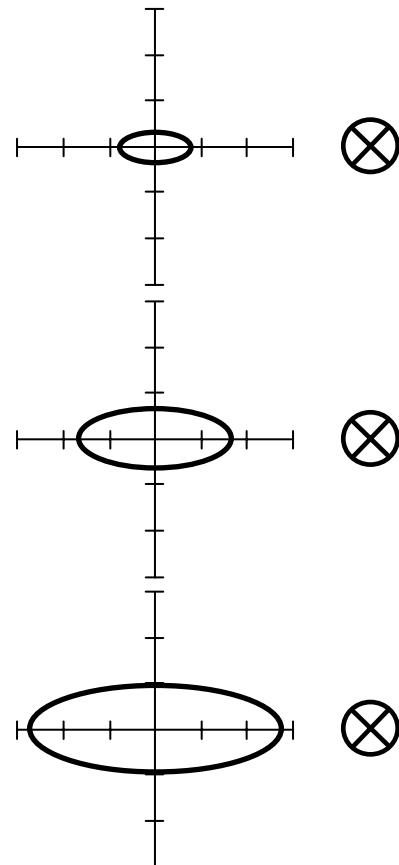


Figure 4: An affine projection of a Gaussian filter into texture space.

# Resampling Filter

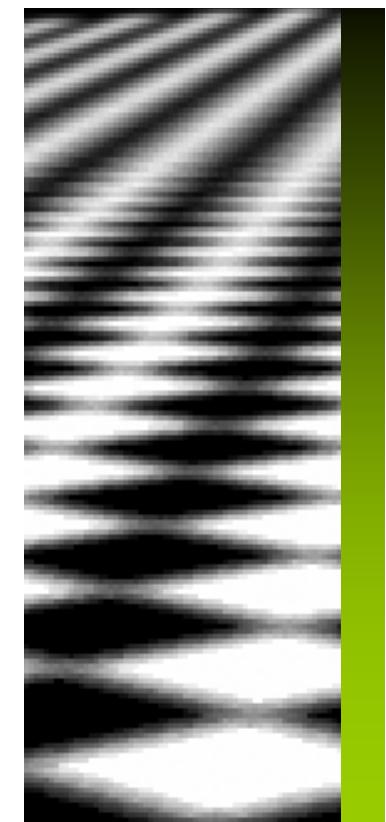
warped recon-  
struction kernel



low-pass  
filter

resampling  
filter

minification



magnification

# EWA resampling

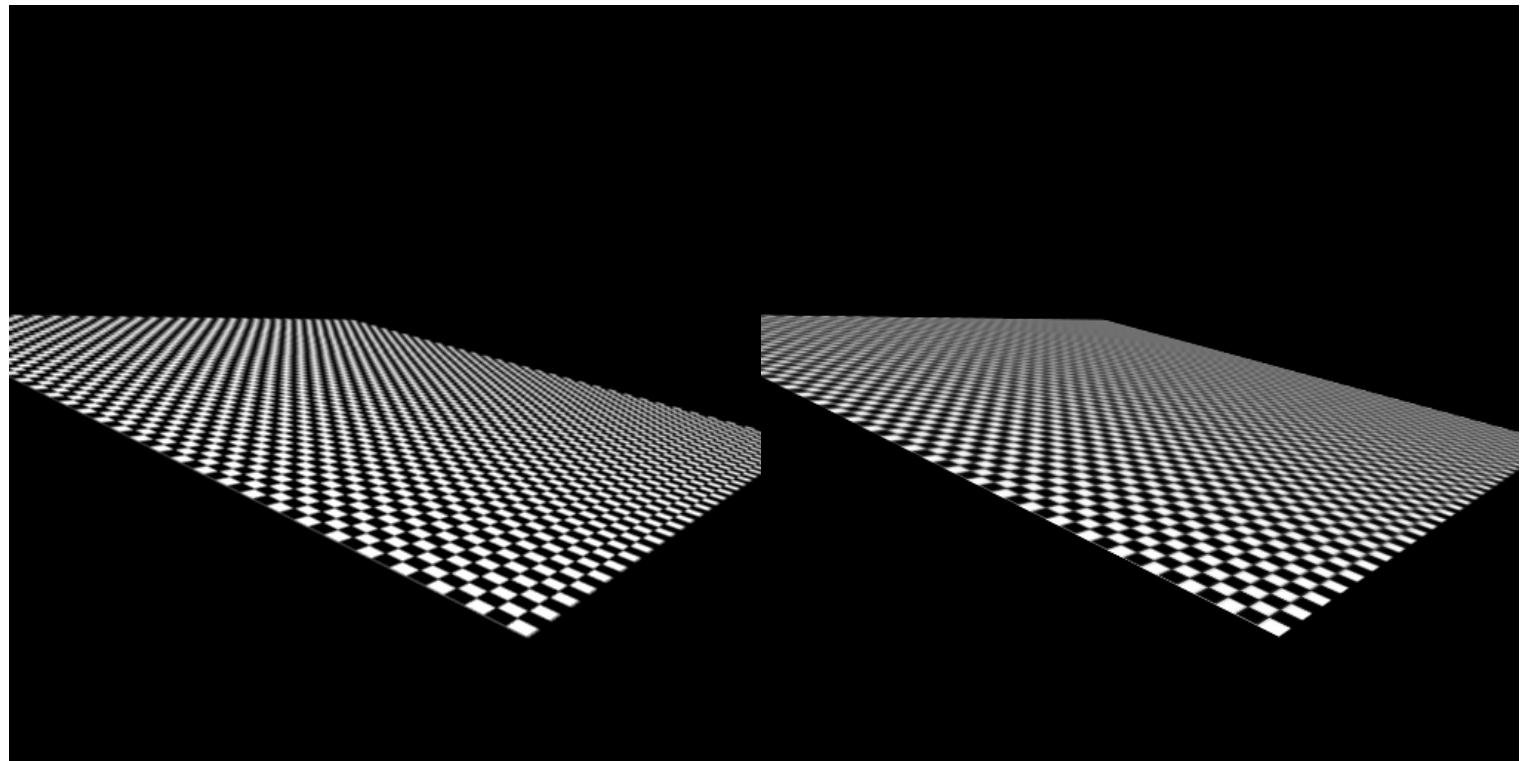
Procula domus, procula ruris, procula prouinciarum, procula  
regnum, procula cordis appetitus, procula, ut alii  
dissimilans, dissimilans, ut vides, dissimilans; et  
dissimilans, dissimilans, ut vides, dissimilans;  
dissimilans, dissimilans, ut vides, dissimilans;  
dissimilans, dissimilans, ut vides, dissimilans; et  
dissimilans, dissimilans, ut vides, dissimilans; et  
dissimilans, dissimilans, ut vides, dissimilans;  
dissimilans, dissimilans, ut vides, dissimilans; et  
dissimilans, dissimilans, ut vides, dissimilans;  
dissimilans, dissimilans, ut vides, dissimilans;

Et 100 impinguis perlungat saeviorisque tridentem,  
und exula exore clavis, nesci illi terminaria suca,  
Aeneas et clavis vestitorum carcere regnat.  
Sic aut, et dico: citius nomini asperiora placent  
exultaque fragor multo auditisque redunt;  
Cunctisque animis et Troes, cunctisque animo  
clerentibus novis scopulis levat ipse eridens  
et vixius aperit Syris et temperat asperos  
atque eotis summas levibus perlabiliter undas,  
ac velut magno in populo cum saepe concita est  
sedatio saevitique animis ignobilis vulgas  
iamque faces et saxa volant, furor arma ministrat;  
tum, pietate gravem ac meritis si forte virum quem  
conspexere, silent arrectisque auribus astant;  
ille regit dictis animis et pectora mulcat:  
sic cunctus pelagi cecidit fragor, aquora postquam  
prospiciens genitor caeloque invetus aperto  
flectit equos curruque volans dat lora secundo.  
Et iam finis erat, cum Iuppiter aethere summo  
despiciens mare velivolum terrasque iacentis  
litoraque et latos populos, sic vertice caeli  
constitit et Libyae defixit lumina regnis.  
atque illum talis iactantem pectore curas  
tristior et lacrimis oculos suffusa nitentis  
adloquitur Venus: 'o qui res hominumque deumque  
aeternis regis imperiis et fulmine terres,  
quid meus Aeneas in te committere tantum,  
quid Troes potuere, quibus tot funera passis  
cunctus ob Italiam terrarum clauditur orbis?  
certe hinc Romanos olim volventibus annis,

# Image Quality Comparison

---

- Trilinear mipmapping



EWA

trilinear mipmapping



L

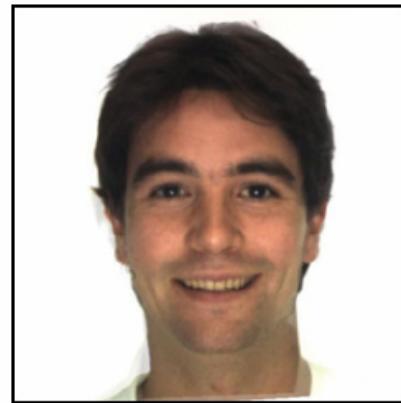
# Bells and whistles

# Morphing & matting

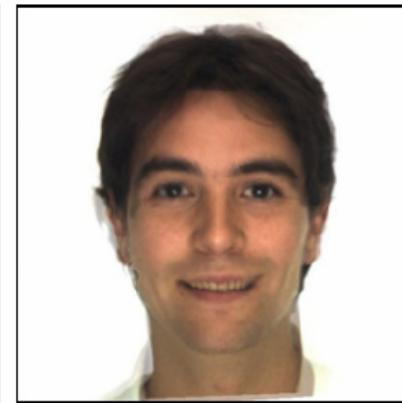
- Extract foreground first to avoid artifacts in the background



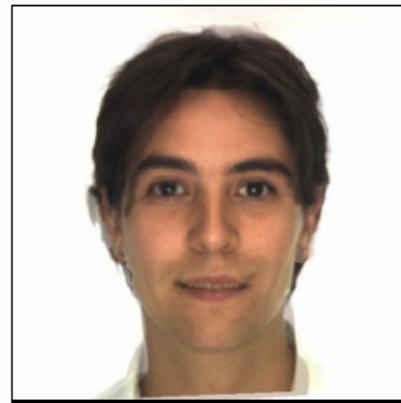
(c)  $\alpha = 0.0$



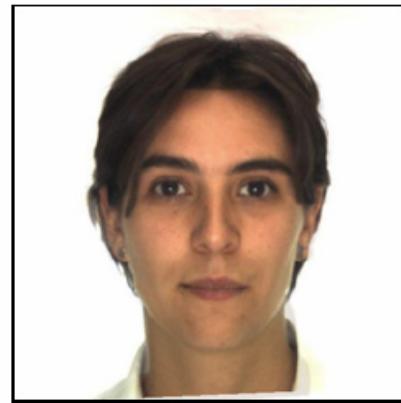
(d)  $\alpha = 0.2$



(e)  $\alpha = 0.4$



(f)  $\alpha = 0.6$



(g)  $\alpha = 0.8$



(h)  $\alpha = 1.0$

# Uniform morphing

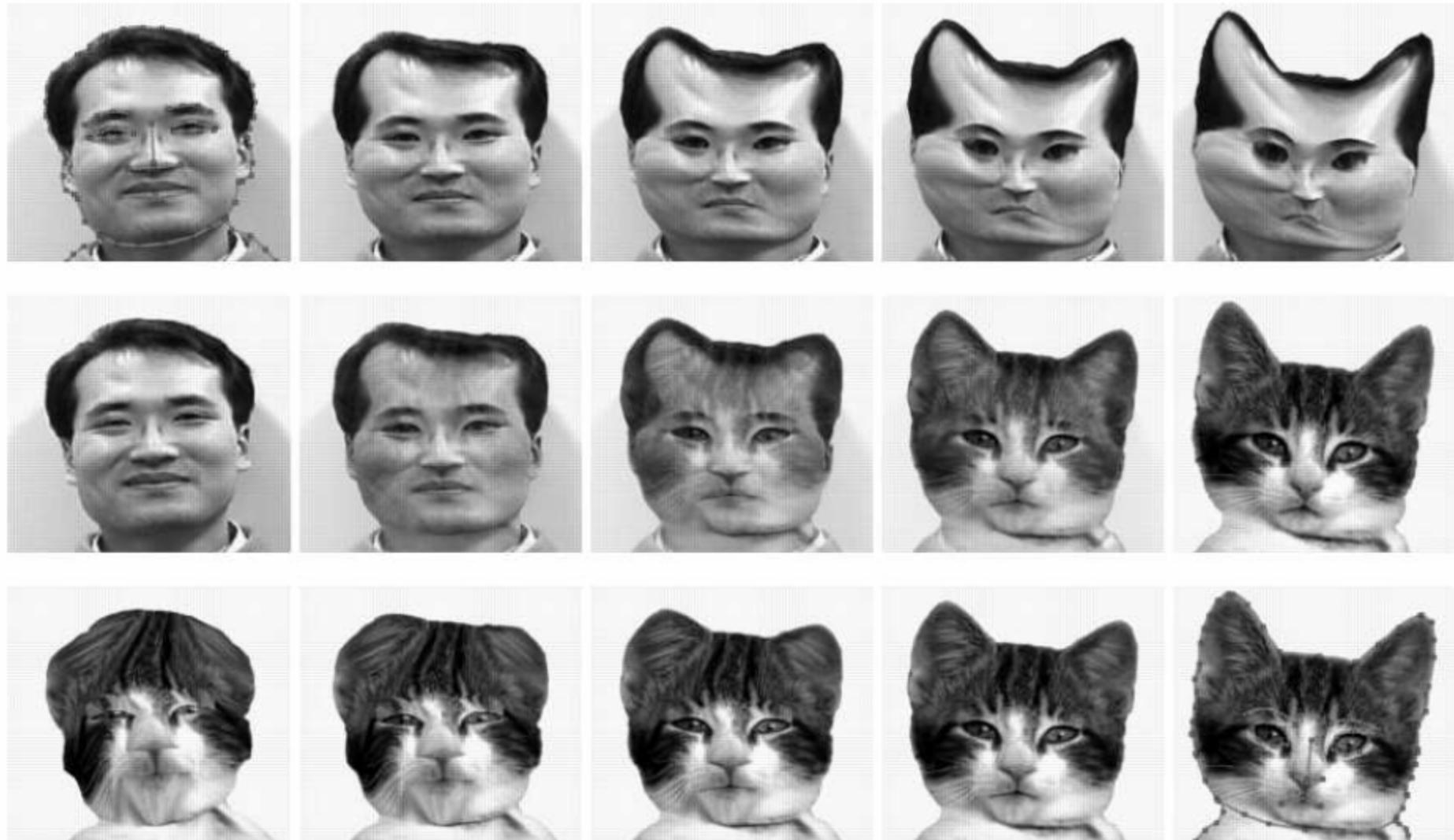
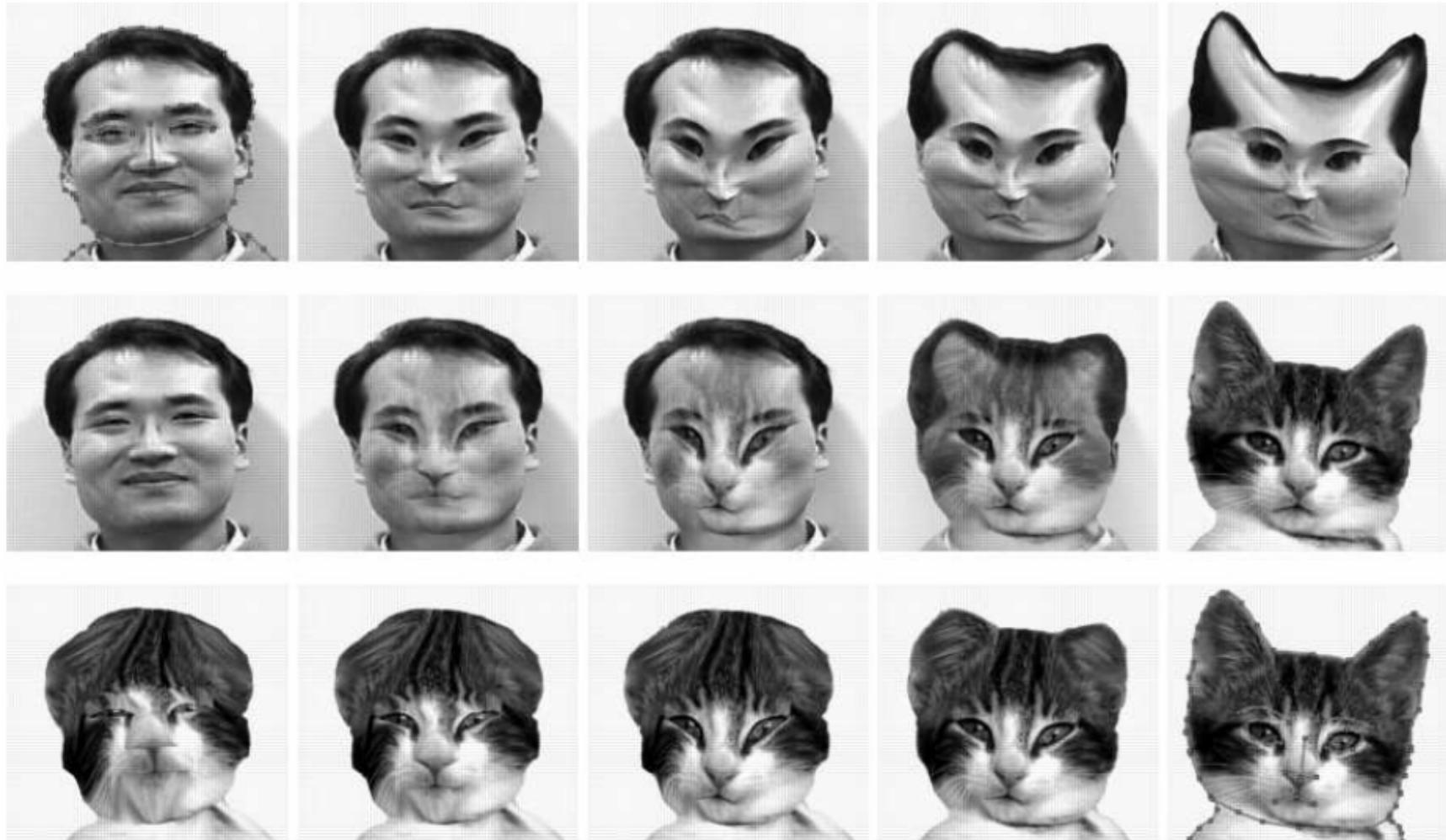


Figure 4. Uniform metamorphosis

# Non-uniform morphing



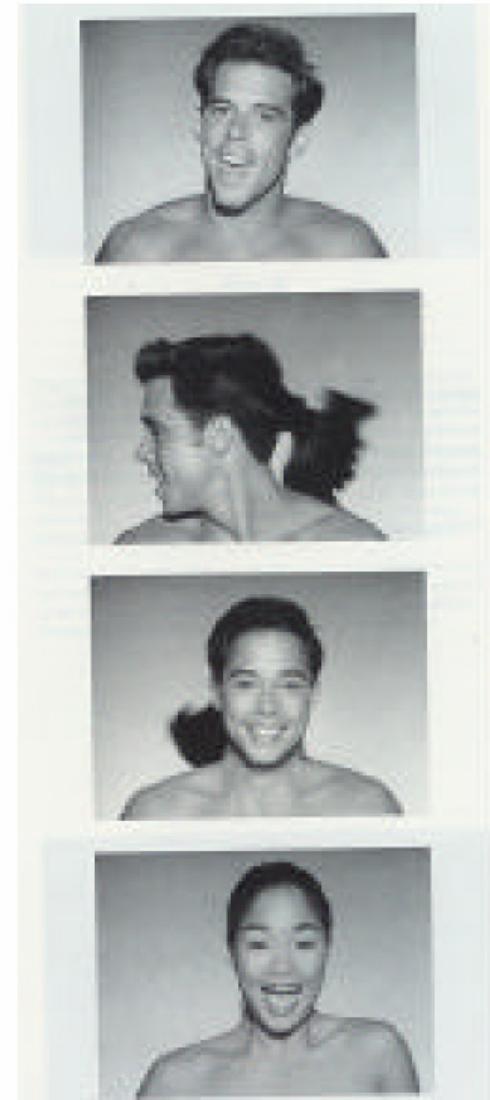
**Figure 5. Nonuniform metamorphosis**

<http://www-cs.ccny.cuny.edu/~wolberg/pub/cgi96.pdf>

# Video

---

- Lots of manual work



# View morphing

# Problem with morphing

- So far, we have performed linear interpolation of feature point positions
- But what happens if we try to morph between two views of the same object?

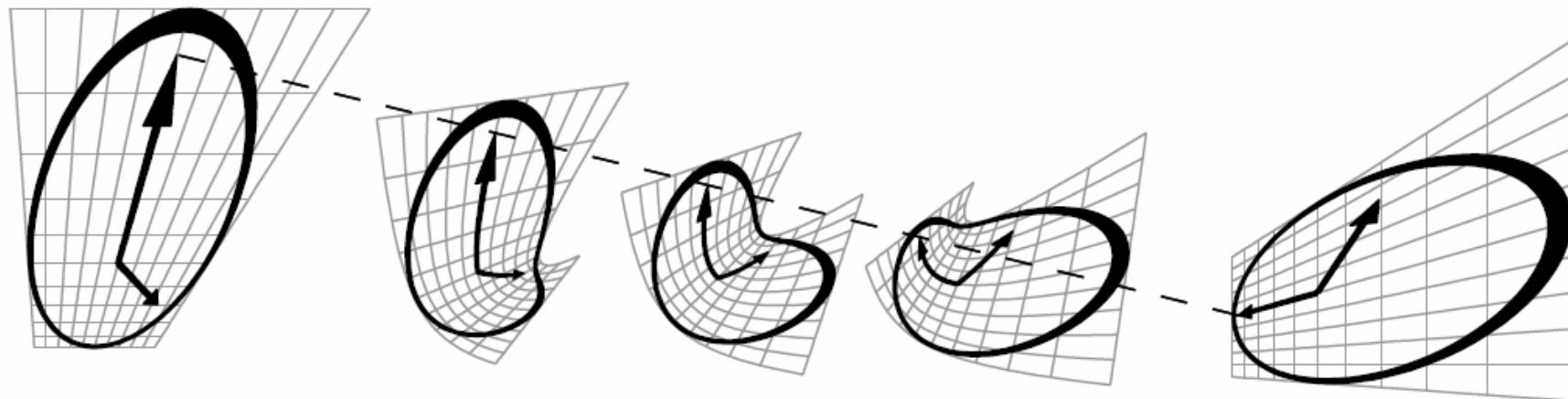


Figure 2: A Shape-Distorting Morph. Linearly interpolating two perspective views of a clock (far left and far right) causes a geometric bending effect in the in-between images. The dashed line shows the linear path of one feature during the course of the transformation. This example is indicative of the types of distortions that can arise with image morphing techniques.

# View morphing

- Seitz & Dyer  
<http://www.cs.washington.edu/homes/seitz/vmorph/vmorph.htm>
- Interpolation consistent with 3D view interpolation

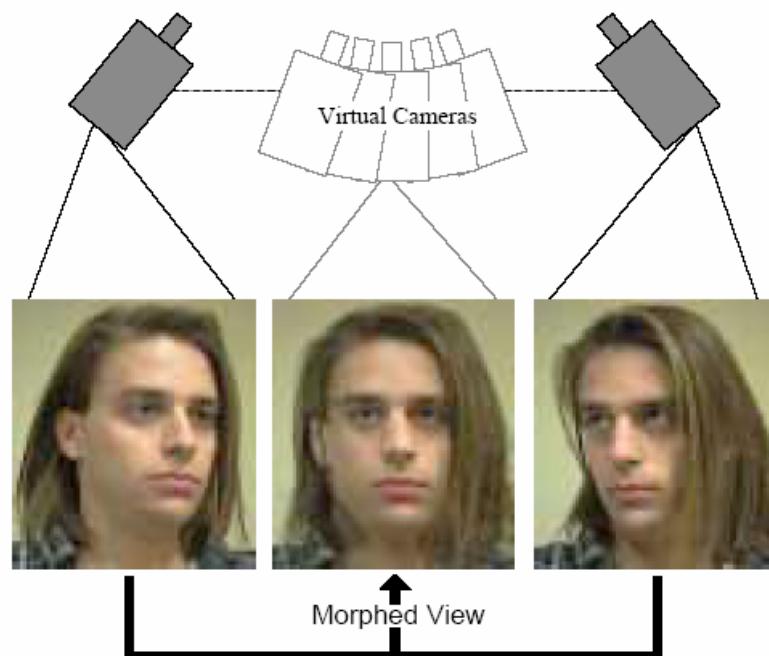


Figure 1: View morphing between two images of an object taken from two different viewpoints produces the illusion of physically moving a virtual camera.

# Main trick

---

- Pre warp with a homography to "pre-align" images
- So that the two views are parallel
  - Because linear interpolation works when views are parallel

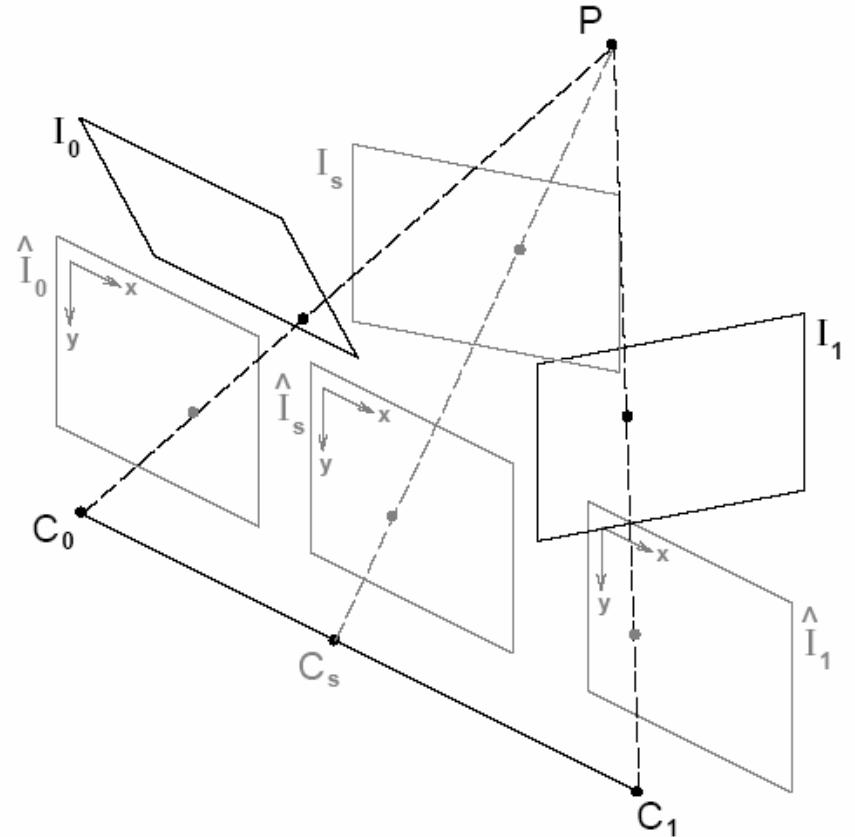


Figure 4: View Morphing in Three Steps. (1) Original images  $I_0$  and  $I_1$  are prewarped to form parallel views  $\hat{I}_0$  and  $\hat{I}_1$ . (2)  $\hat{I}_s$  is produced by morphing (interpolating) the prewarped images. (3)  $\hat{I}_s$  is postwarped to form  $I_s$ .

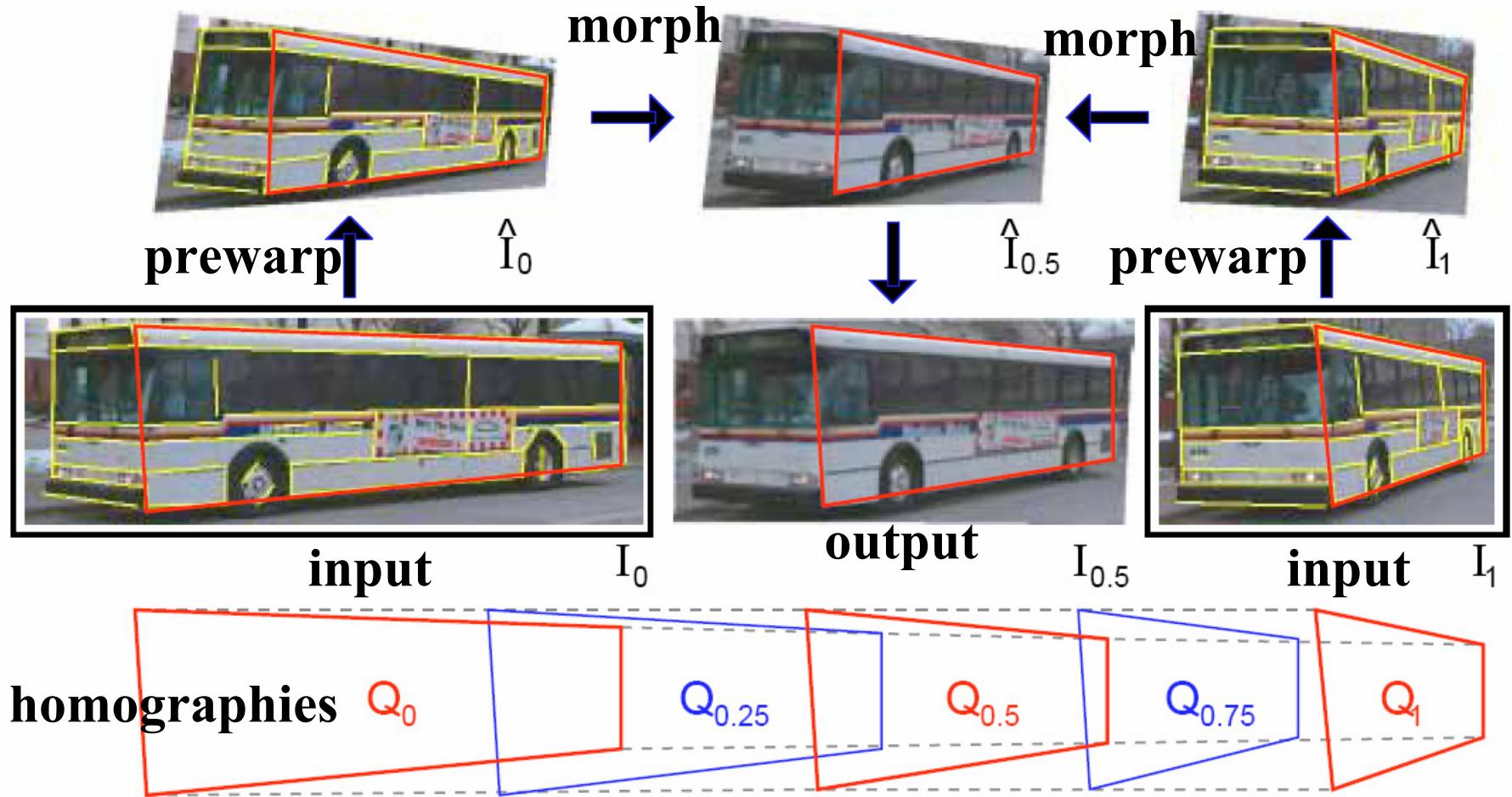


Figure 6: View Morphing Procedure: A set of features (yellow lines) is selected in original images  $I_0$  and  $I_1$ . Using these features, the images are automatically prewarped to produce  $\hat{I}_0$  and  $\hat{I}_1$ . The prewarped images are morphed to create a sequence of in-between images, the middle of which,  $\hat{I}_{0.5}$ , is shown at top-center.  $\hat{I}_{0.5}$  is interactively postwarped by selecting a quadrilateral region (marked red) and specifying its desired configuration,  $Q_{0.5}$ , in  $I_{0.5}$ . The postwarps for other in-between images are determined by interpolating the quadrilaterals (bottom).

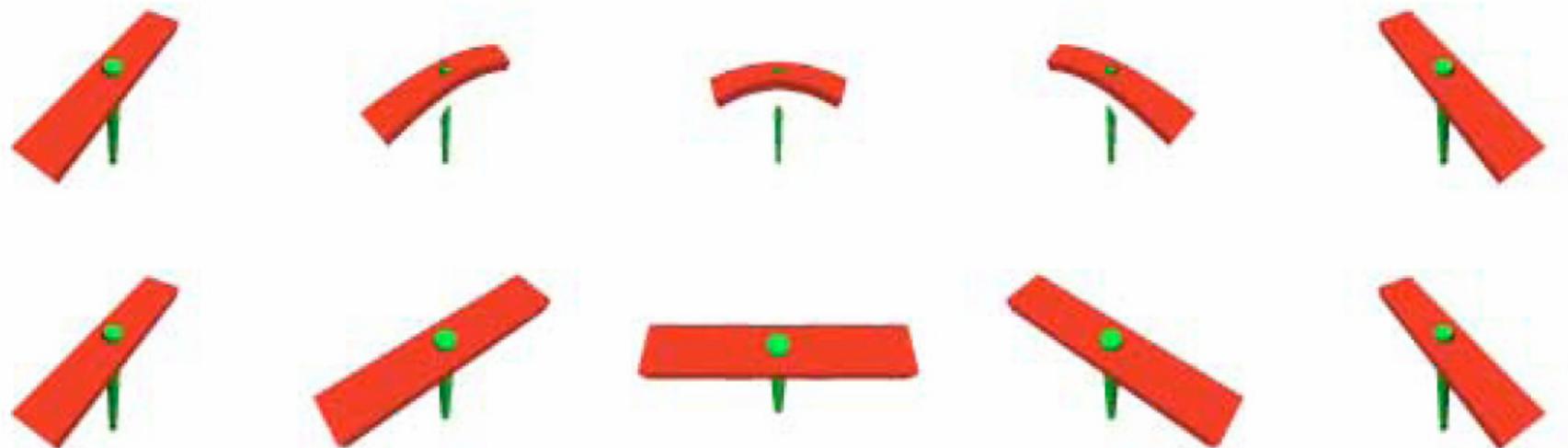


Figure 10: Image Morphing Versus View Morphing. Top: image morph between two views of a helicopter toy causes the in-between images to contract and bend. Bottom: view morph between the same two views results in a physically consistent morph. In this example the image morph also results in an extraneous hole between the blade and the stick. Holes can appear in view morphs as well.

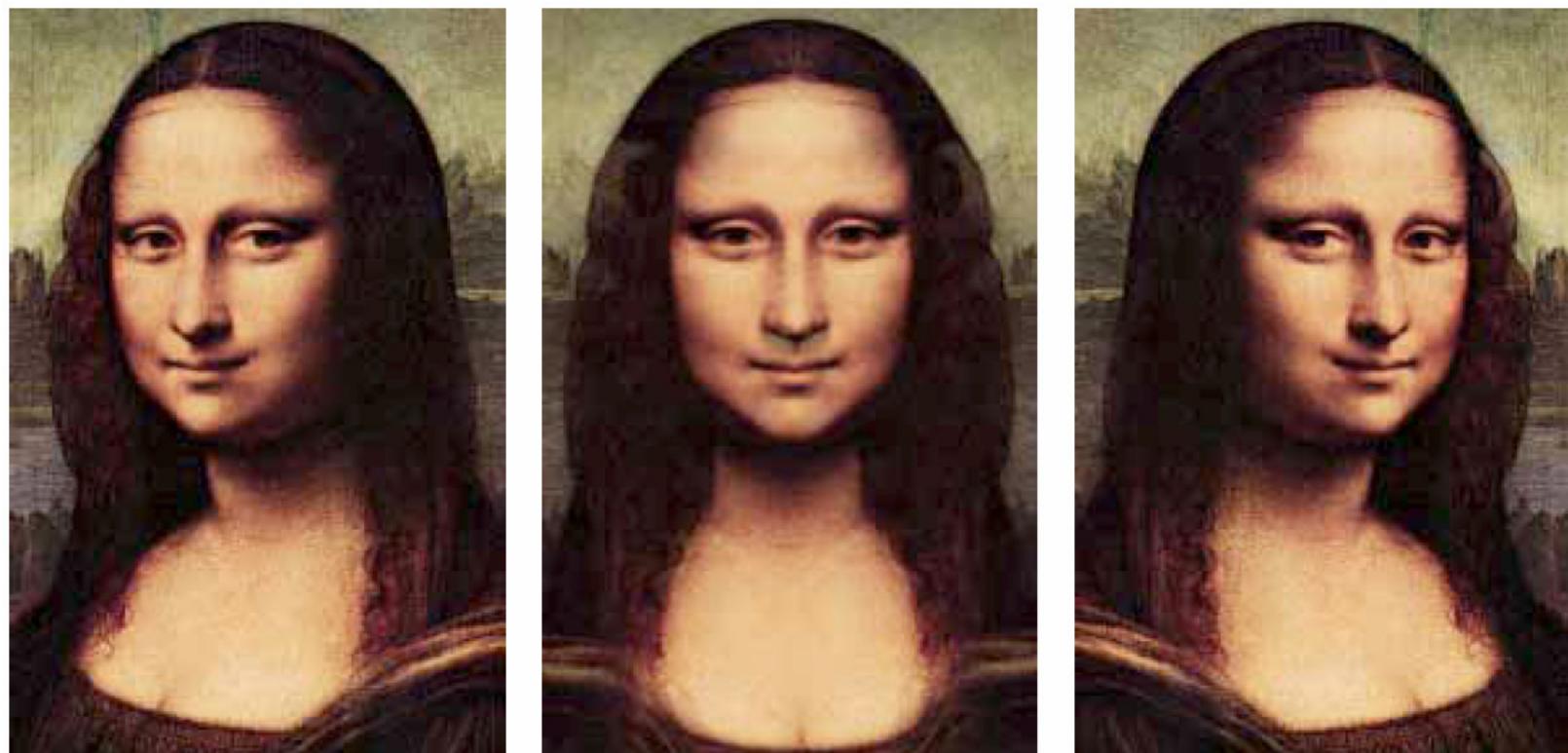


Figure 9: Mona Lisa View Morph. Morphed view (center) is halfway between original image (left) and it's reflection (right).

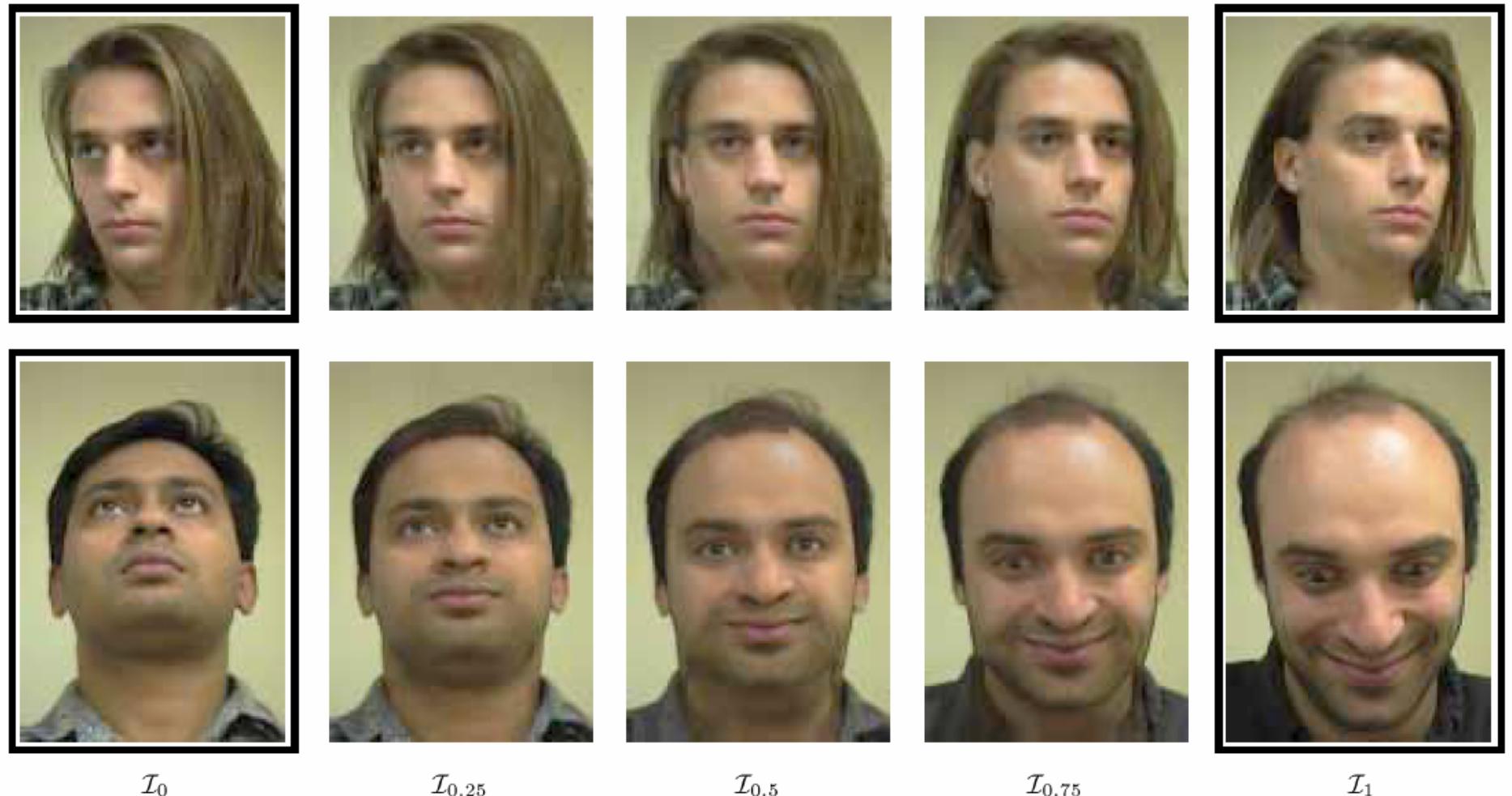
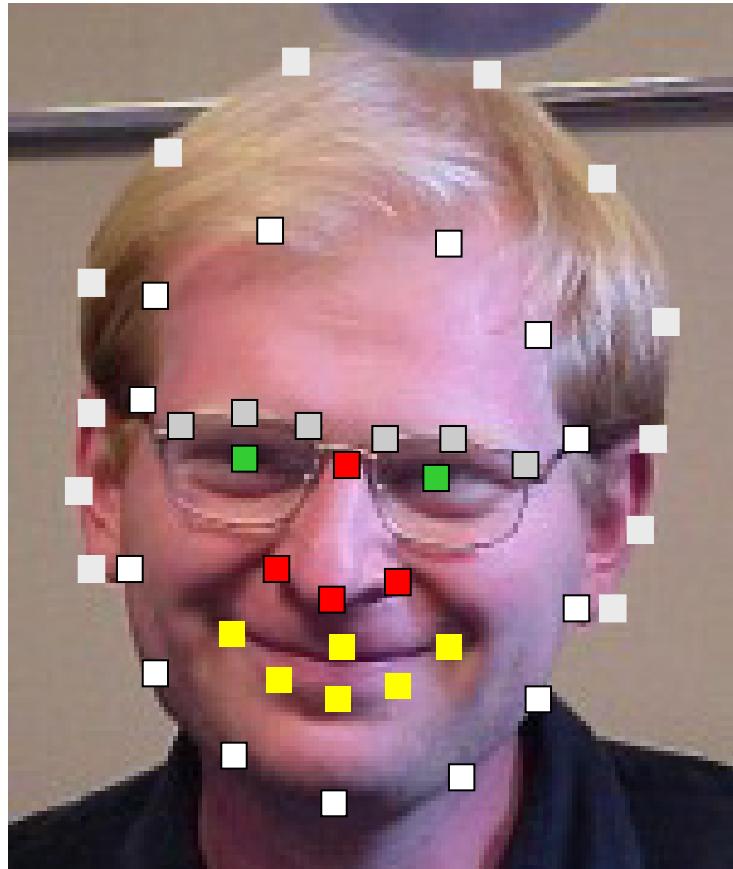


Figure 7: Facial View Morphs. Top: morph between two views of the same person. Bottom: morph between views of two different people. In each case, view morphing captures the change in facial pose between original images  $\mathcal{I}_0$  and  $\mathcal{I}_1$ , conveying a natural 3D rotation.

# Extensions

# Shape Vector



=



Provides alignment!

43

Slide Alyosha Efros

# The Morphable face model

- Again, assuming that we have  $m$  such vector pairs in full correspondence, we can form new shapes  $\mathbf{S}_{model}$  and new appearances  $\mathbf{T}_{model}$  as:

$$\mathbf{S}_{model} = \sum_{i=1}^m a_i \mathbf{S}_i \quad \mathbf{T}_{model} = \sum_{i=1}^m b_i \mathbf{T}_i$$

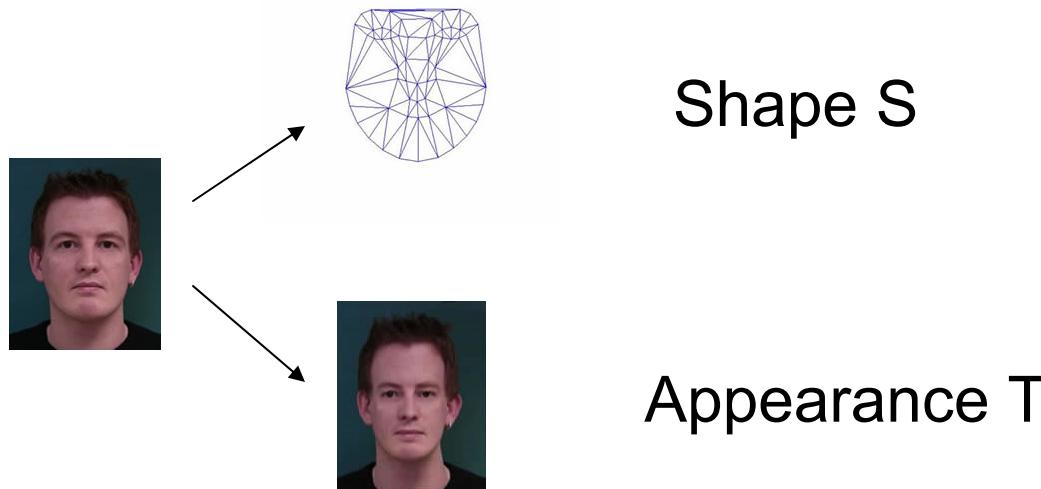
$$s = \alpha_1 \cdot \text{face}_1 + \alpha_2 \cdot \text{face}_2 + \alpha_3 \cdot \text{face}_3 + \alpha_4 \cdot \text{face}_4 + \dots = \mathbf{S} \cdot \mathbf{a}$$

$$t = \beta_1 \cdot \text{face}_1 + \beta_2 \cdot \text{face}_2 + \beta_3 \cdot \text{face}_3 + \beta_4 \cdot \text{face}_4 + \dots = \mathbf{T} \cdot \mathbf{b}$$

- If number of basis faces  $m$  is large enough to span the face subspace then:
- Any new face can be represented as a pair of vectors

# The Morphable Face Model

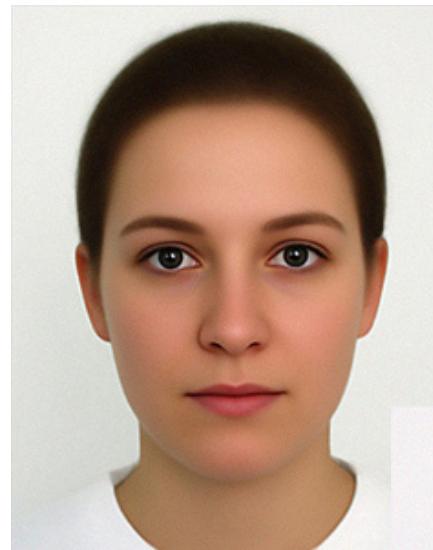
- The actual structure of a face is captured in the shape vector  $S = (x_1, y_1, x_2, \dots, y_n)^T$ , containing the  $(x, y)$  coordinates of the  $n$  vertices of a face, and the appearance (texture) vector  $T = (R_1, G_1, B_1, R_2, \dots, G_n, B_n)^T$ , containing the color values of the mean-warped face image.



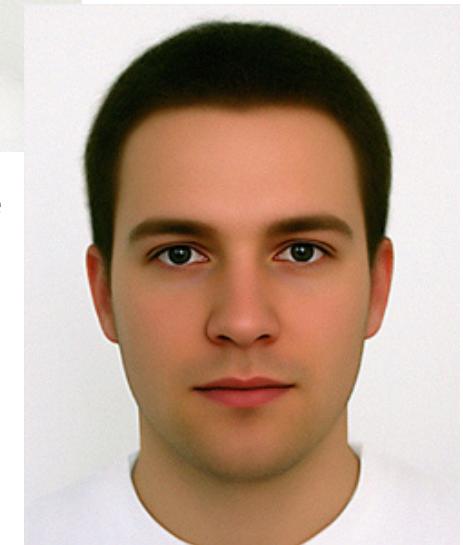
# Subpopulation means

---

- Examples:
  - Happy faces
  - Young faces
  - Asian faces
  - Etc.
  - Sunny days
  - Rainy days
  - Etc.
  - Etc.



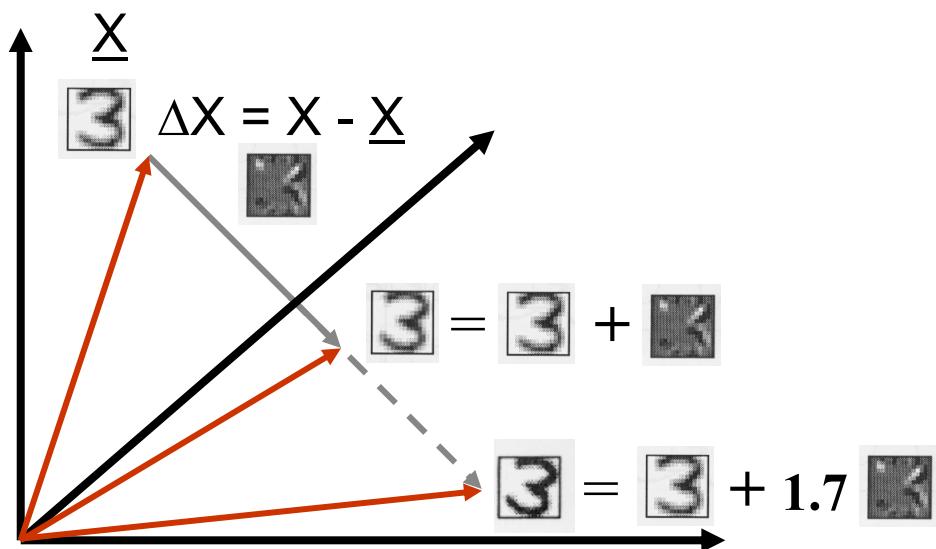
Average female



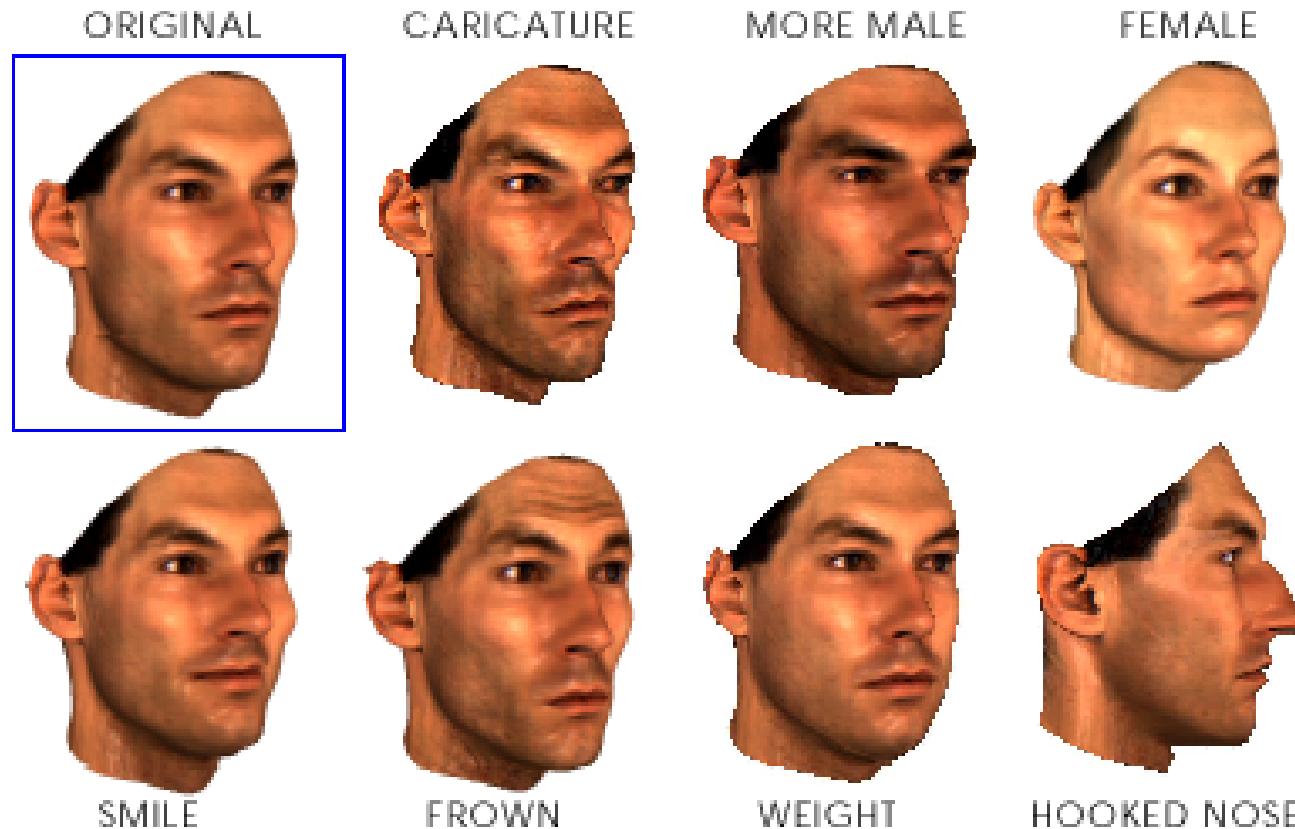
Average male

# Deviations from the mean

---



# Using 3D Geometry: Blanz & Vetter, 1999



show SIGGRAPH video

# **Manipulating Facial Appearance through Shape and Color**

**Duncan A. Rowland and David I. Perrett**

*St Andrews University*

**IEEE CG&A, September 1995**

# Morphable face models

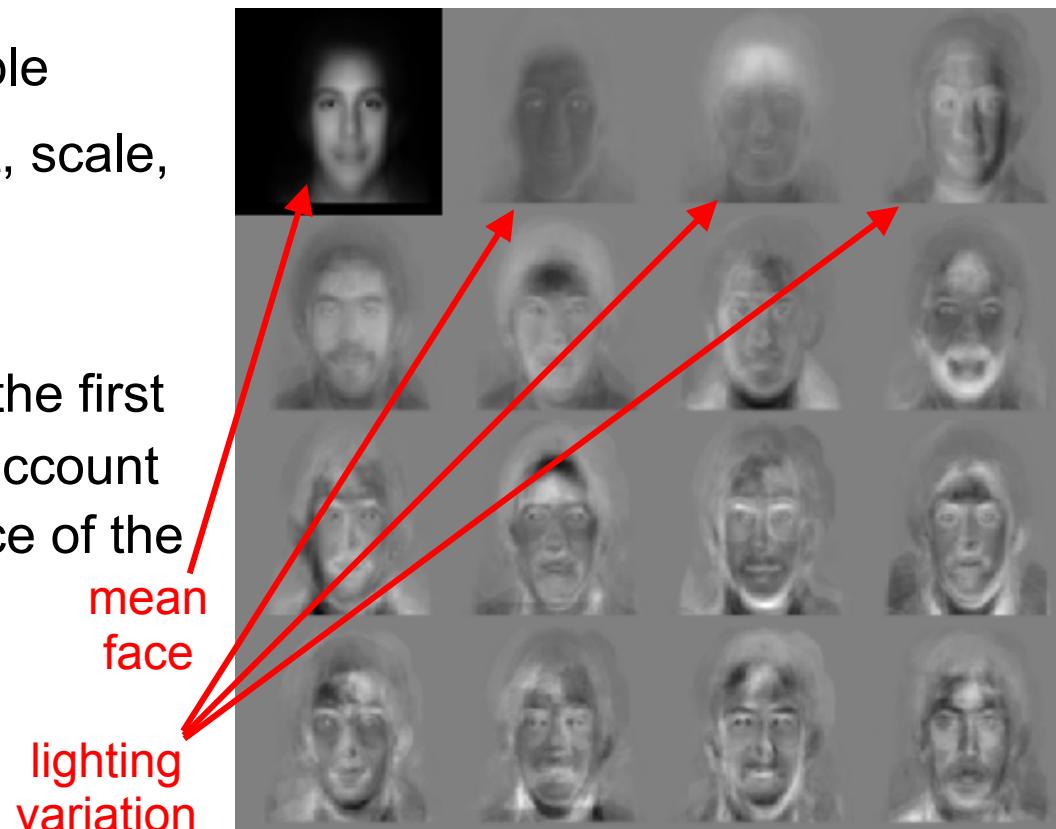
---

- <http://citeseer.ist.psu.edu/cache/papers/cs/704/http:zSzwww.ai.mit.eduzSzprojectsSzcbclzSzpublicationSzSzpszSzICCV98-matching2.pdf/jones98multidimensional.pdf>
- <http://www.kyb.mpg.de/publication.html?user=volker>

# EigenFaces

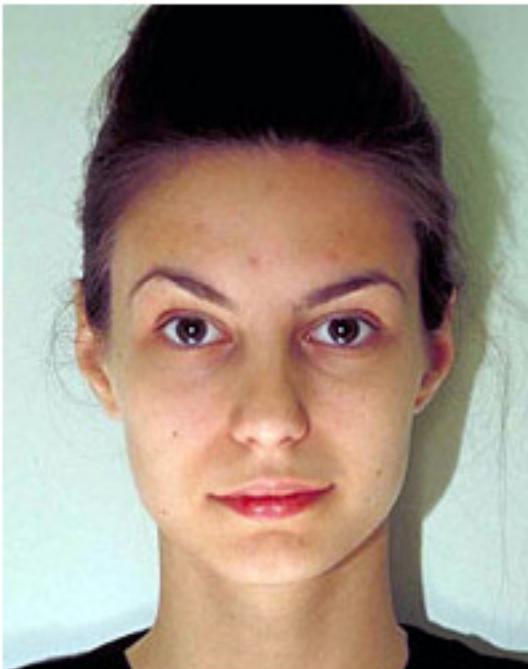
First popular use of PCA on images was for modeling and recognition of faces [Kirby and Sirovich, 1990, Turk and Pentland, 1991]

- Collect a face ensemble
- Normalize for contrast, scale, & orientation.
- Remove backgrounds
- Apply PCA & choose the first  $N$  eigen-images that account for most of the variance of the data.



# The average face

- [http://www.uni-regensburg.de/Fakultaeten/phil Fak II/Psychologie/Psy II/beautycheck/english/index.htm](http://www.uni-regensburg.de/Fakultaeten/phil_Fak_II/Psychologie/Psy_II/beautycheck/english/index.htm)



On the left: the “real” Miss Germany 2002 (= Miss Berlin) and on the right: the “virtual” Miss Germany, which was computed by blending together all contestants of the final round and was rated as being much more attractive.

# Figure-centric averages



Antonio Torralba & Aude Oliva (2002)

**Averages:** Hundreds of images containing a person are averaged to reveal regularities in the intensity patterns across all the images.

# Jason Salavon



Homes for Sale



109 Homes for Sale,  
Seattle/Tacoma



117 Homes for Sale,  
Chicagoland



124 Homes for Sale, The 5  
Boroughs



121 Homes for Sale,  
LA/Orange County



114 Homes for Sale,  
Dallas/Ft. Worth Metroplex



112 Homes for Sale,  
Miami-Dade County

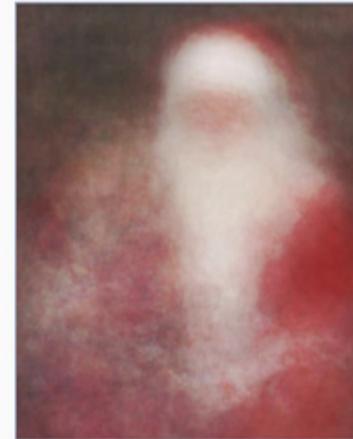
Slide Alyosha Efros

More at: <http://www.salavon.com/>

# “100 Special Moments” by Jason Salavon



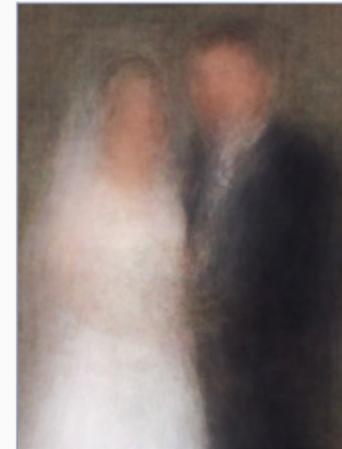
Little Leaguer



Kids with Santa



The Graduate



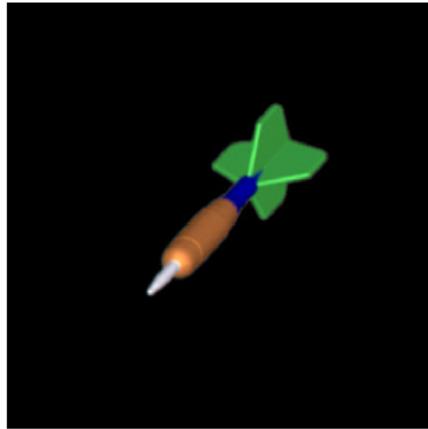
Newlyweds

Slide Alyosha Efros

Why  
blurry?

# 3D morphing

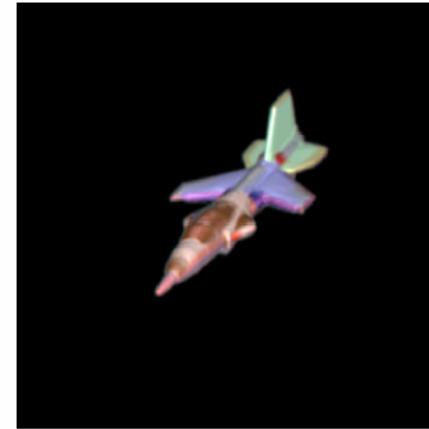
- Feature-Based Volume Metamorphosis Lerios, Garfinkle, and Levoy.
- <http://www-graphics.stanford.edu/~tolis/toli/research/morph.html>



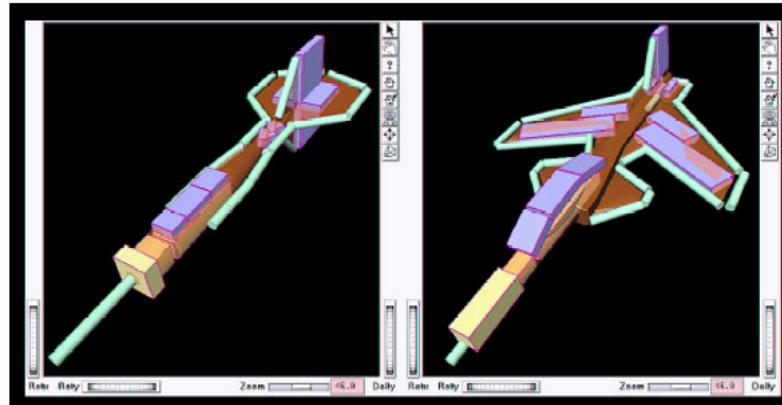
(a) Dart volume from scan-converted polygon mesh.



(b) X-29 volume from scan-converted polygon mesh.

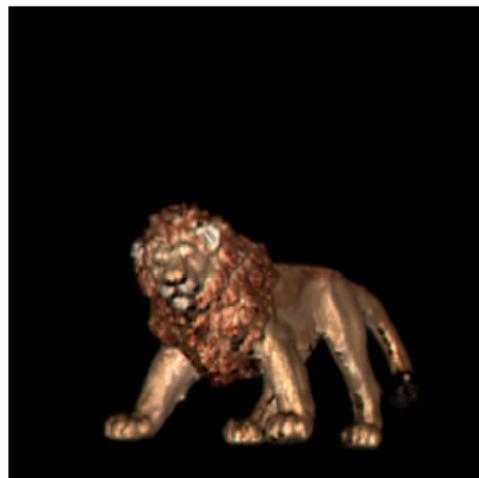


(c) Volume morph halfway between dart and X-29.

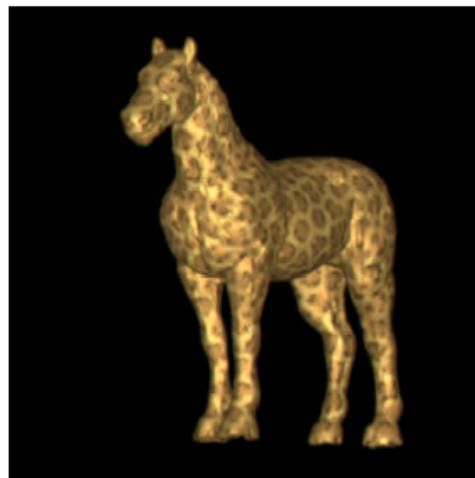


# 3D morphing

- Feature-Based Volume Metamorphosis Lerios, Garfinkle, and Levoy.
- <http://www-graphics.stanford.edu/~tolis/toli/research/morph.html>



(a) Lion volume from scan-converted polygon mesh.



(b) Leopard-horse volume from scan-converted polygon mesh.



(c) Volume morph halfway between lion and leopard-horse.

# Automatic morphing

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- <http://ccc.inaoep.mx/~fuentes/zanella.pdf>



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# Recap & Significance

# Recap

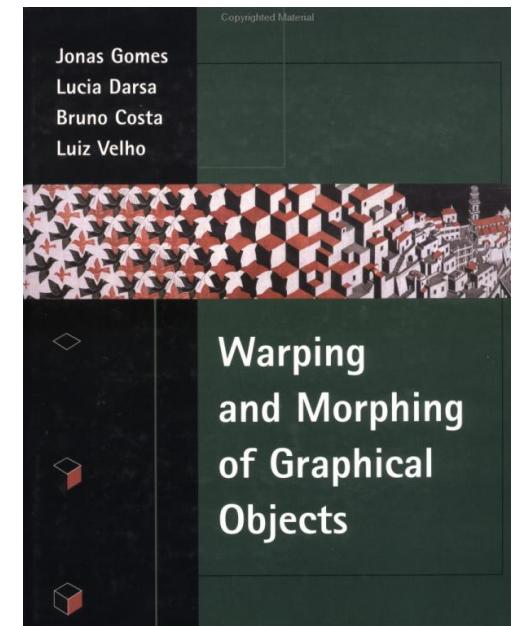
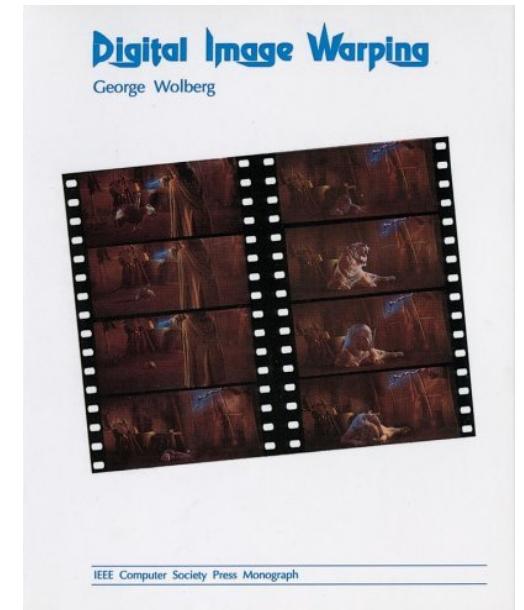
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- Idea that linear interpolation introduces blur
- Separation of shape and color
- Idea of non-rigid alignment of different images
  - Applications to medical data
- Applications, related to
  - Special effects
  - Face recognition
  - Video frame interpolation
  - MPEG
- Scattered data interpolation

# References

# Refs

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- <http://www.visgraf.impa.br/cgi-bin/morphQuery.cgi?output=html>
- <http://www.cg.tuwien.ac.at/research/ca/mrm/>
- <http://w3.impa.br/~morph/sites.html>
- <http://w3.impa.br/~morph/sig-course/slides.html>
- <http://www.owlnet.rice.edu/~elec539/Projects97/morphjrks/morph.html>
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- [http://www.uoguelph.ca/~mwirth/PHD Chapter4.pdf](http://www.uoguelph.ca/~mwirth/PHD_Chapter4.pdf)



# Software

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- <http://www.morpheussoftware.net/>
- <http://www.debugmode.com/winmorph/>
- [http://www.stoik.com/products/morphman/mm1\\_main.htm](http://www.stoik.com/products/morphman/mm1_main.htm)
- [http://www.creativecow.net/articles/zwar\\_chris/morph/index.html](http://www.creativecow.net/articles/zwar_chris/morph/index.html)
- <http://meesoft.logicnet.dk/SmartMorph/>
- <http://www.asahi-net.or.jp/~FX6M-FJMY/mop00e.html>
- <http://morphing-software-review.toptenreviews.com/>
- <http://www.freedomdownloadscenter.com/Search/morphing.html>



# Next time: Panoramas

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