



# Image Warping

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## Image Processing

- Quantization
  - Uniform Quantization
  - Random dither
  - Ordered dither
  - Floyd-Steinberg dither
- Pixel operations
  - Add random noise
  - Add luminance
  - Add contrast
  - Add saturation
- Filtering
  - Blur
  - Detect edges
- Warping
  - Scale
  - Rotate
  - Warp
- Combining
  - Composite
  - Morph

## Image Processing

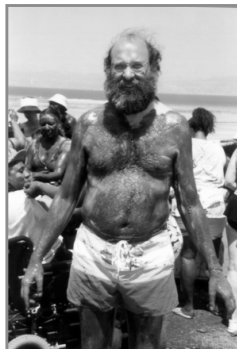


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## Image Warping



- Move pixels of image
  - Mapping
  - Resampling



Source image

Warp →



Destination image

## Overview

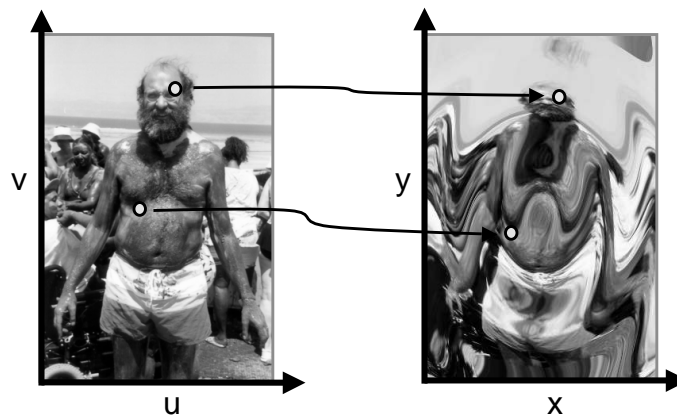


- Mapping
  - Forward
  - Reverse
- Resampling
  - Point sampling
  - Triangle filter
  - Gaussian filter

## Mapping



- Define transformation
  - Describe the destination  $(x,y)$  for every location  $(u,v)$  in the source (or vice-versa, if invertible)

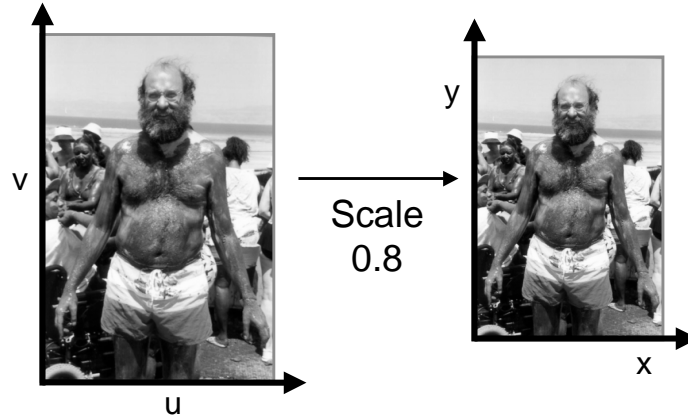


## Example Mappings



- Scale by *factor*.

- $x = \text{factor} * u$
- $y = \text{factor} * v$

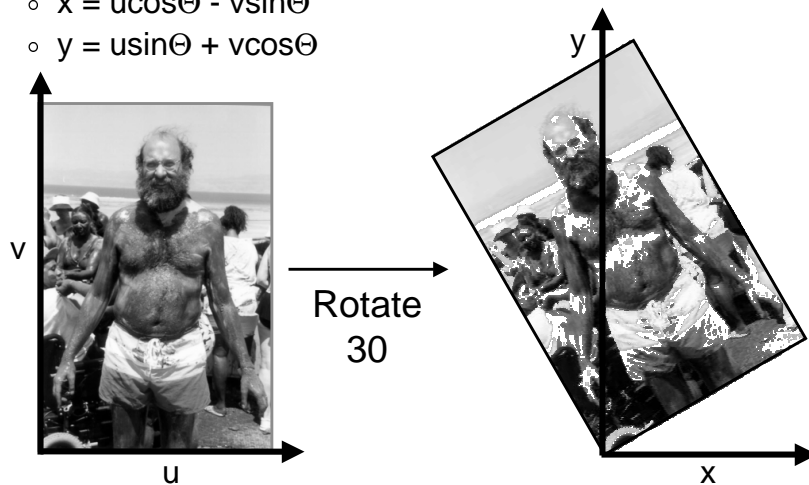


## Example Mappings



- Rotate by  $\Theta$  degrees:

- $x = u \cos \Theta - v \sin \Theta$
- $y = u \sin \Theta + v \cos \Theta$

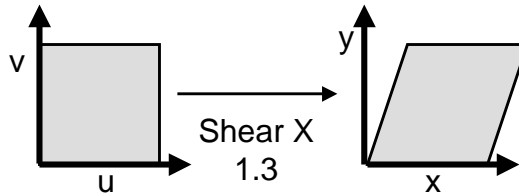


## Example Mappings



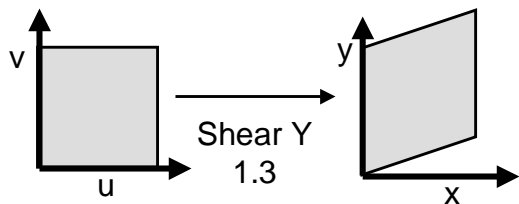
- Shear in X by factor:

- $x = u + \text{factor} * v$
- $y = v$



- Shear in Y by factor:

- $x = u$
- $y = v + \text{factor} * u$



## Other Mappings



- Any function of u and v:

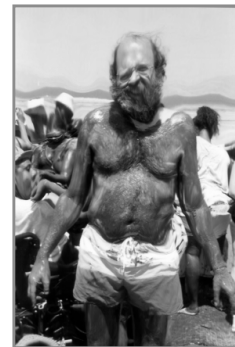
- $x = f_x(u,v)$
- $y = f_y(u,v)$



Fish-eye



“Swirl”



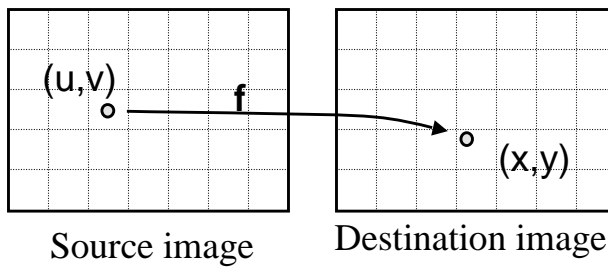
“Rain”

## Image Warping Implementation I



- Forward mapping:

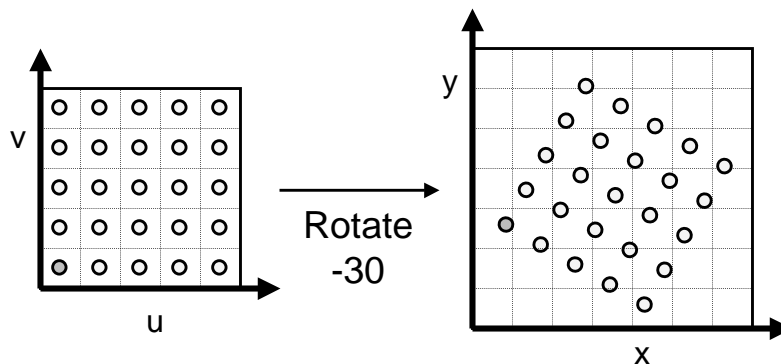
```
for (int u = 0; u < umax; u++) {  
  for (int v = 0; v < vmax; v++) {  
    float x = fx(u,v);  
    float y = fy(u,v);  
    dst(x,y) = src(u,v);  
  }  
}
```



## Forward Mapping



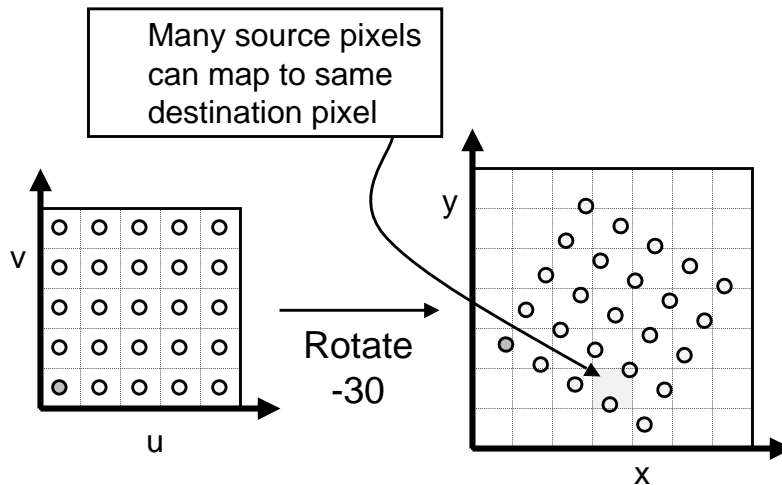
- Iterate over source image



## Forward Mapping - NOT



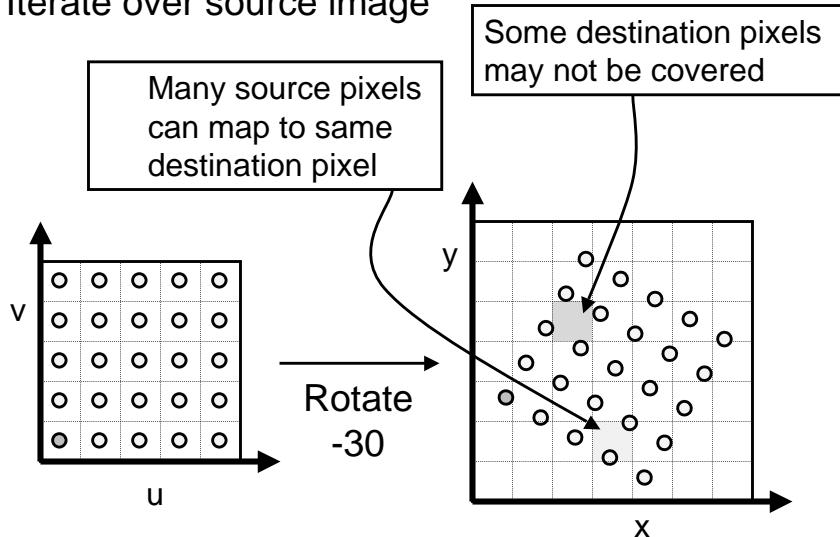
- Iterate over source image



## Forward Mapping - NOT



- Iterate over source image

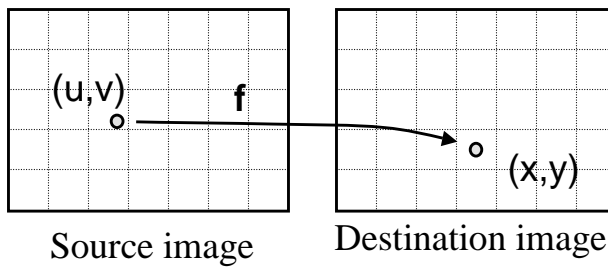


## Image Warping Implementation II



- Reverse mapping:

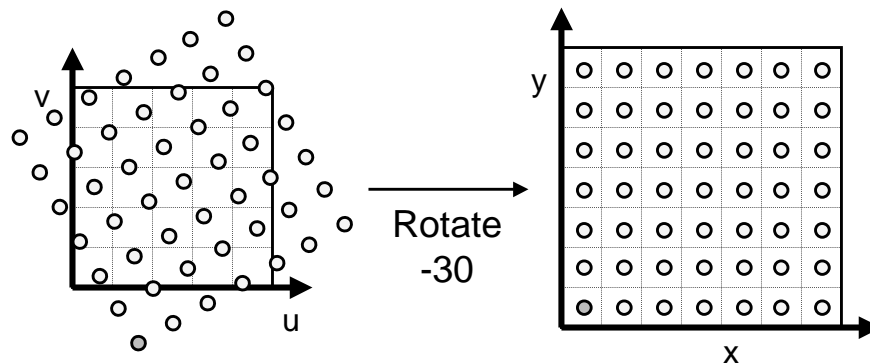
```
for (int x = 0; x < xmax; x++) {  
  for (int y = 0; y < ymax; y++) {  
    float u =  $f_x^{-1}(x,y)$ ;  
    float v =  $f_y^{-1}(x,y)$ ;  
    dst(x,y) = src(u,v);  
  }  
}
```



## Reverse Mapping



- Iterate over destination image
  - Must resample source
  - May oversample, but much simpler!



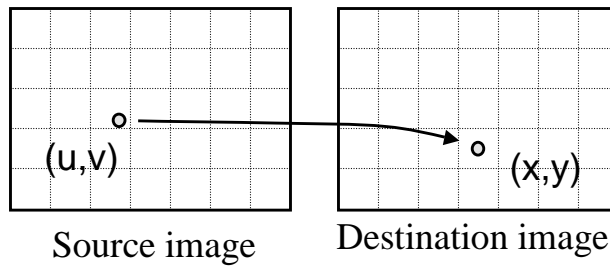


## Resampling



- Evaluate source image at arbitrary  $(u,v)$

$(u,v)$  does not usually have integer coordinates



## Overview



- Mapping
  - Forward
  - Reverse
- » **Resampling**
  - Point sampling
  - Triangle filter
  - Gaussian filter

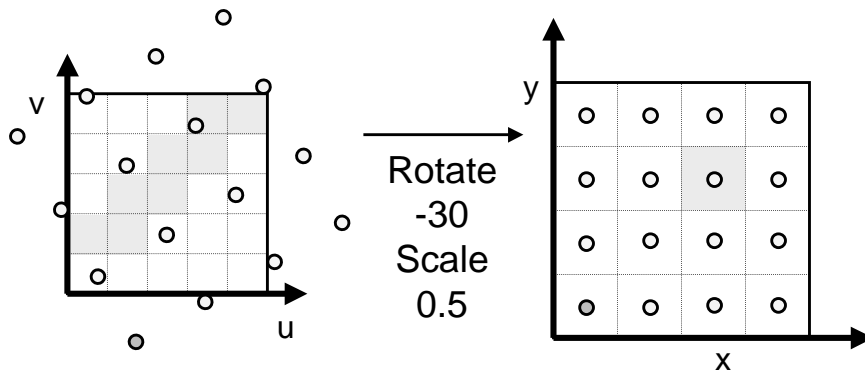
## Point Sampling



- Take value at closest pixel:

- $\text{int } iu = \text{trunc}(u+0.5);$
- $\text{int } iv = \text{trunc}(v+0.5);$
- $\text{dst}(x,y) = \text{src}(iu,iv);$

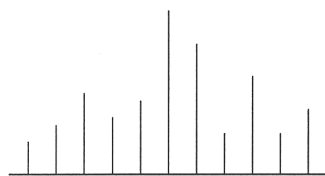
This method is simple,  
but it causes aliasing



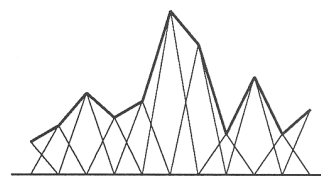
## Triangle Filtering



- Convolve with triangle filter



Input



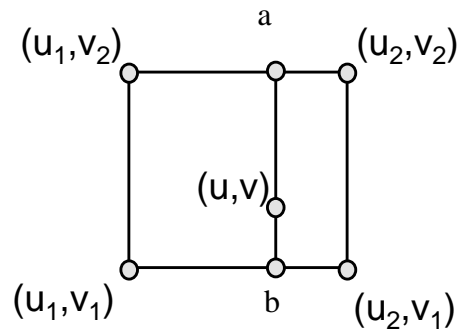
Output

Figure 2.4 Wolberg

## Triangle Filtering



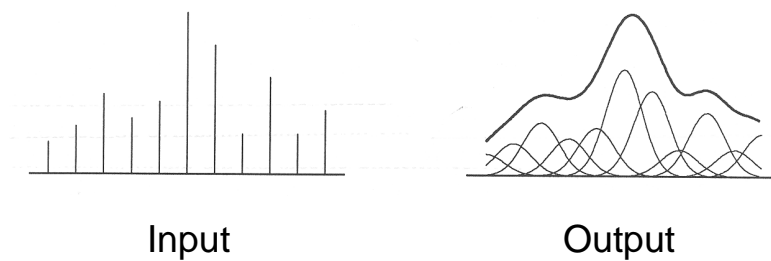
- Bilinearly interpolate four closest pixels
  - $a$  = linear interpolation of  $\text{src}(u_1, v_2)$  and  $\text{src}(u_2, v_2)$
  - $b$  = linear interpolation of  $\text{src}(u_1, v_1)$  and  $\text{src}(u_2, v_1)$
  - $\text{dst}(x, y)$  = linear interpolation of “ $a$ ” and “ $b$ ”



## Gaussian Filtering



- Convolve with Gaussian filter



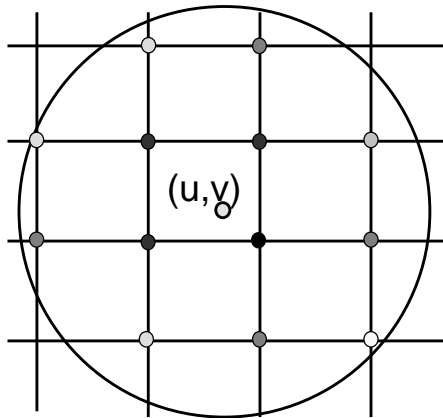
Width of Gaussian kernel affects blurriness

Figure 2.4 Wolberg

## Gaussian Filtering



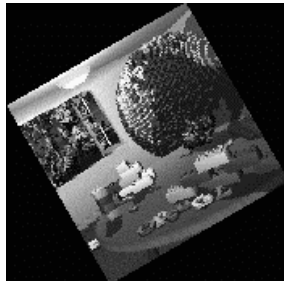
- Compute weighted sum of pixel neighborhood:
  - Weights are normalized values of Gaussian function



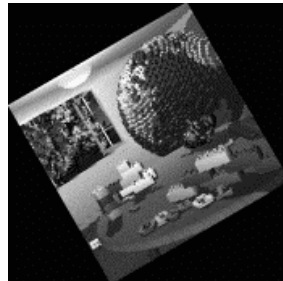
## Filtering Methods Comparison



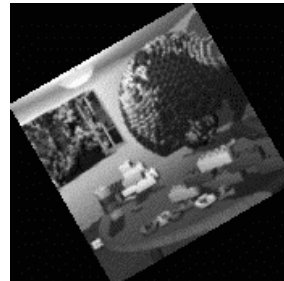
- Trade-offs
  - Aliasing versus blurring
  - Computation speed



Point



Bilinear



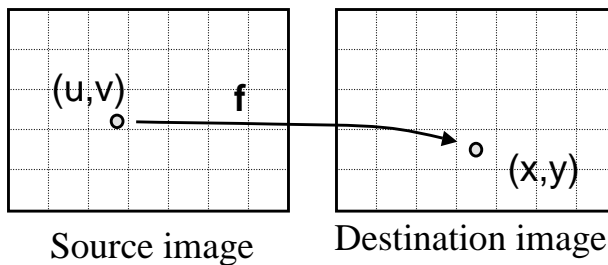
Gaussian

## Image Warping Implementation



- Reverse mapping:

```
for (int x = 0; x < xmax; x++) {  
  for (int y = 0; y < ymax; y++) {  
    float u =  $f_x^{-1}(x,y)$ ;  
    float v =  $f_y^{-1}(x,y)$ ;  
    dst(x,y) = resample_src(u,v,w);  
  }  
}
```

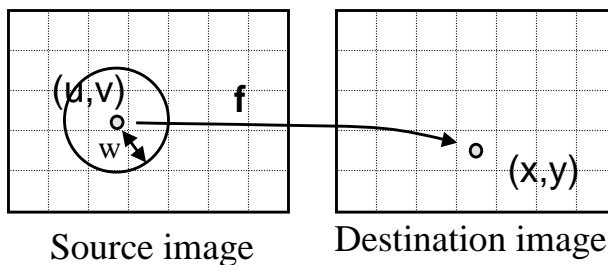


## Image Warping Implementation



- Reverse mapping:

```
for (int x = 0; x < xmax; x++) {  
  for (int y = 0; y < ymax; y++) {  
    float u =  $f_x^{-1}(x,y)$ ;  
    float v =  $f_y^{-1}(x,y)$ ;  
    dst(x,y) = resample_src(u,v,w);  
  }  
}
```

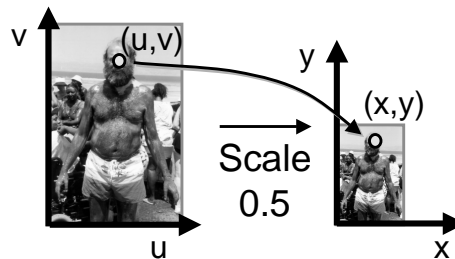


## Example: Scale



- Scale (src, dst, sx, sy):

```
float w = max(1.0/sx,1.0/sy);
for (int x = 0; x < xmax; x++) {
  for (int y = 0; y < ymax; y++) {
    float u = x / sx;
    float v = y / sy;
    dst(x,y) = resample_src(u,v,w);
  }
}
```



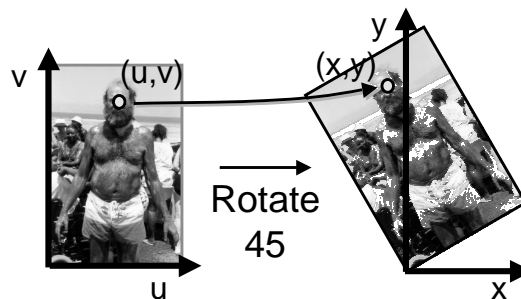
## Example: Rotate



- Rotate (src, dst, theta):

```
for (int x = 0; x < xmax; x++) {
  for (int y = 0; y < ymax; y++) {
    float u = x*cos(-theta) - y*sin(-theta);
    float v = x*sin(-theta) + y*cos(-theta);
    dst(x,y) = resample_src(u,v,w);
  }
}
```

$$x = u\cos\theta - v\sin\theta$$
$$y = u\sin\theta + v\cos\theta$$

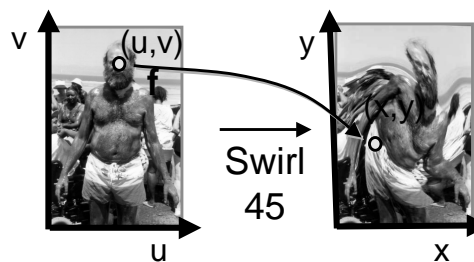


## Example: Fun



- Swirl (src, dst, theta):

```
for (int x = 0; x < xmax; x++) {  
  for (int y = 0; y < ymax; y++) {  
    float u = rot(dist(x,xcenter)*theta);  
    float v = rot(dist(y,ycenter)*theta);  
    dst(x,y) = resample_src(u,v,w);  
  }  
}
```



## Summary



- Mapping
  - Forward
  - Reverse
- Resampling
  - Point sampling
  - Triangle filter
  - Gaussian filter

Reverse mapping  
is simpler to implement

Different filters trade-off  
speed and aliasing/blurring

Fun and creative warps  
are easy to implement!

## Next Time



- Quantization
  - Uniform Quantization
  - Random dither
  - Ordered dither
  - Floyd-Steinberg dither
- Pixel operations
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  - Add luminance
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