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# Image Warping: A Review

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# Objectives

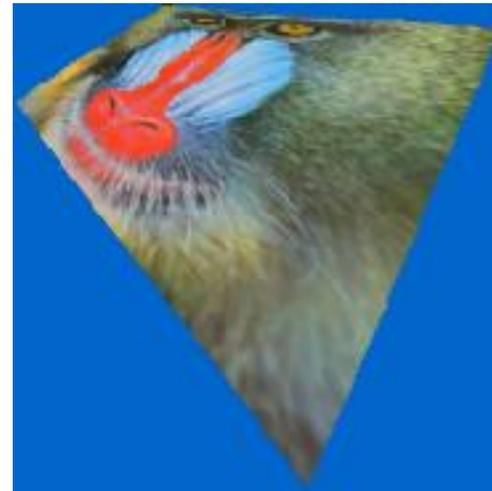
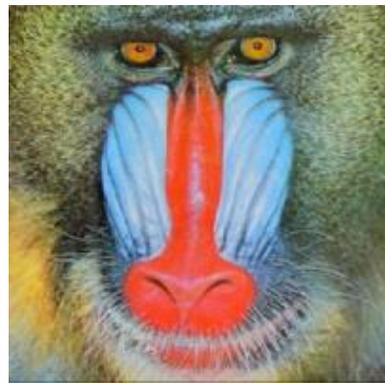
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- In this lecture we review digital image warping:
  - Geometric transformations
  - Forward inverse mapping
  - Sampling
  - Image reconstruction
  - Interpolation kernels
  - Separable transforms
  - Fant's resampling algorithm

# Definition

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- Image warping deals with the geometric transformation of digital images.



# Geometric Transformations

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- Affine
- Perspective
- Bilinear
- Polynomial
- Splines
- Elastic (local deformations)

# Spatial Transformations

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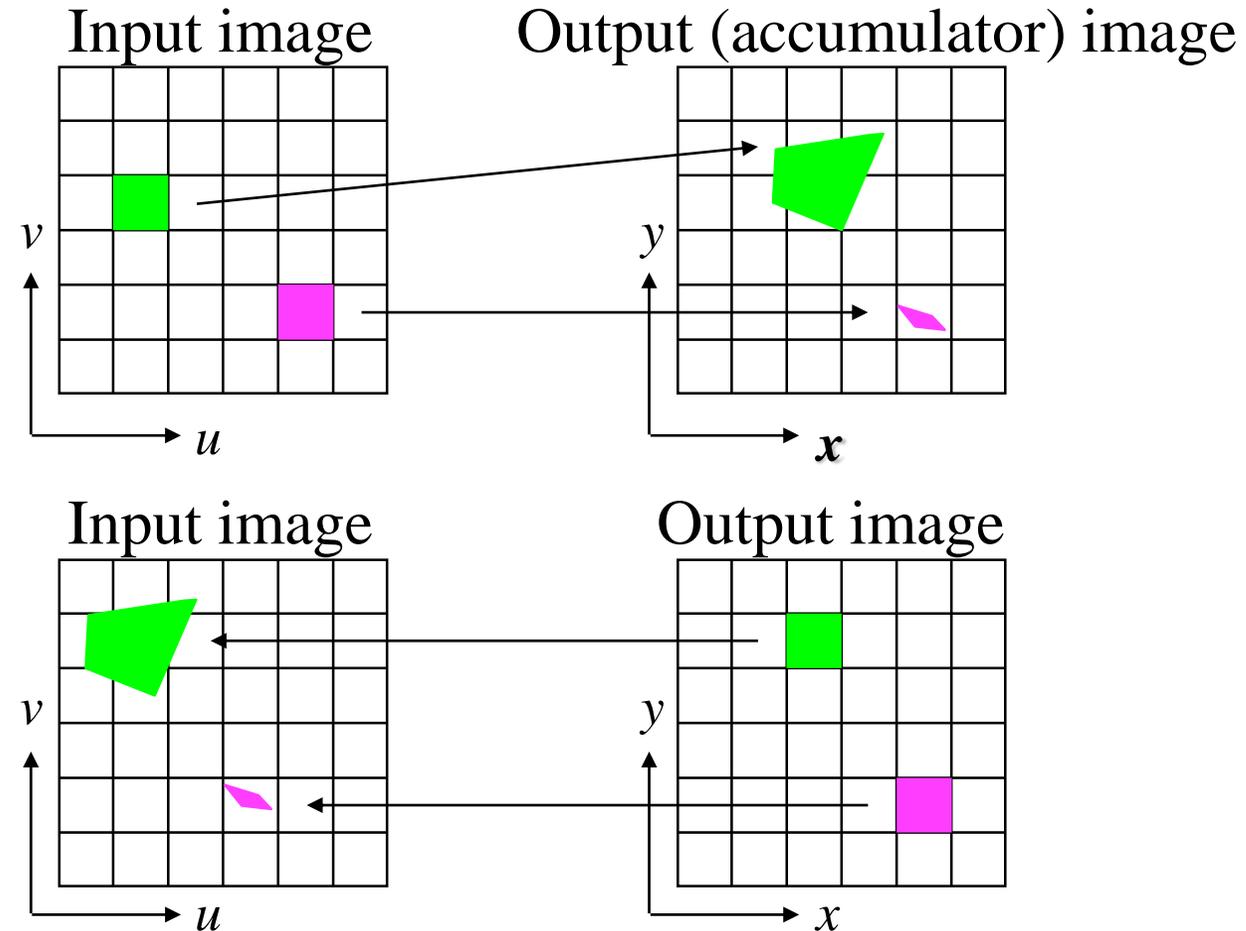
- Forward Mapping  
v]
- Inverse Mapping  
y), V(x, y)]

$$[x, y] = [X(u, v), Y(u,$$

$$[u, v] = [U(x,$$

# Forward / Inverse Mapping

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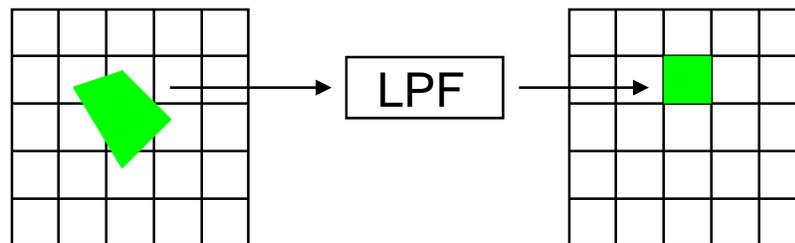
# Sampling

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- Point Sampling



- Area Sampling



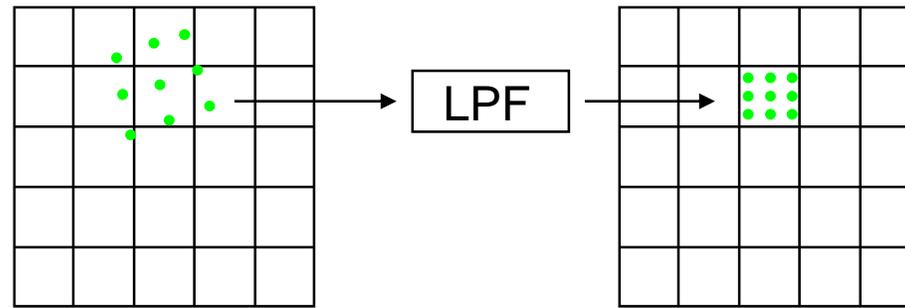
# Area Sampling

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- Treats pixels as finite areas
- Avoids aliasing (undersampling) artifacts
- Approximated by supersampling

# Supersampling

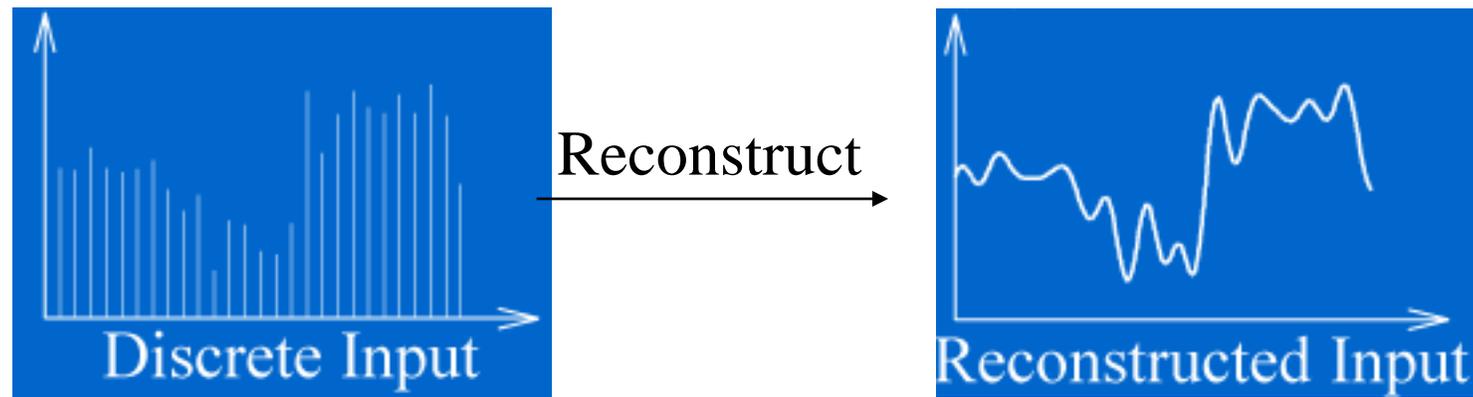
- Average of projected subpixels



# Image Reconstruction

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- Pixel values are known at integer positions
- Samples can project to real-valued positions
- How do we evaluate the image values at these real-valued positions?  
Reconstruction



# Interpolation

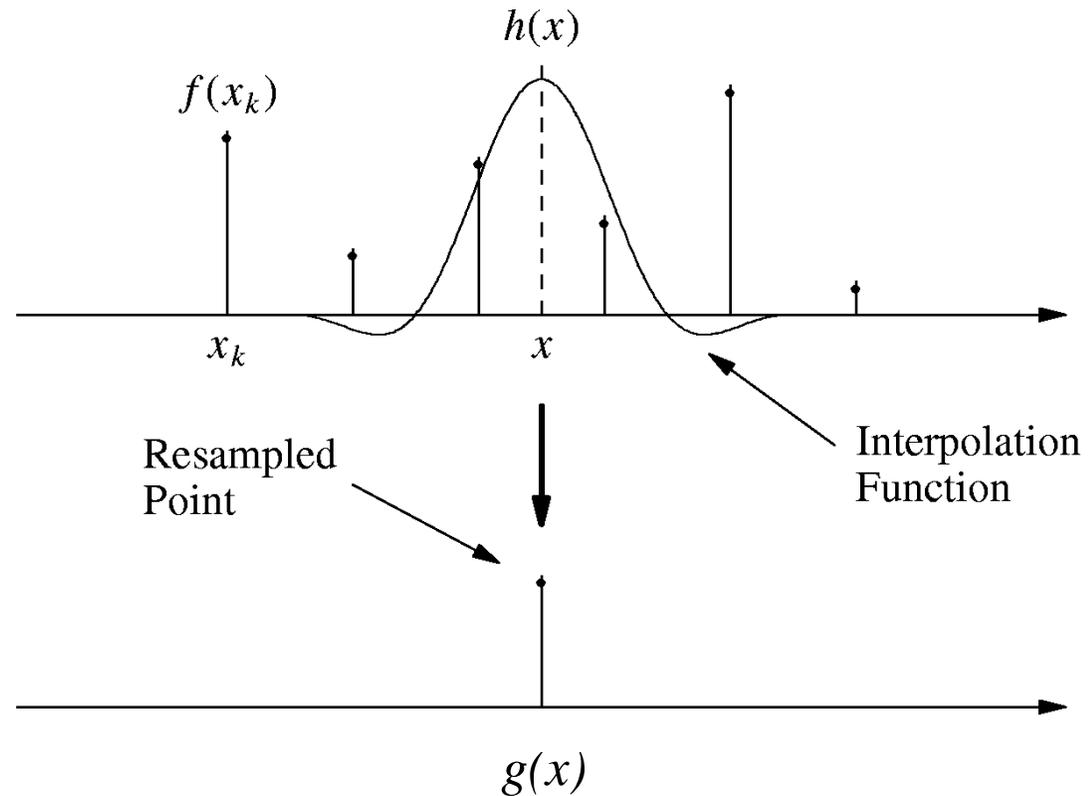
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- Reconstruction interpolates the input
- In practice, interpolation is performed at points of interest only, not entire function
- Interpolation is achieved by convolution

# Convolution

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$$g(x) = \sum_{k=0}^N f(x_k)h(x - x_k)$$



# Interpolation Functions

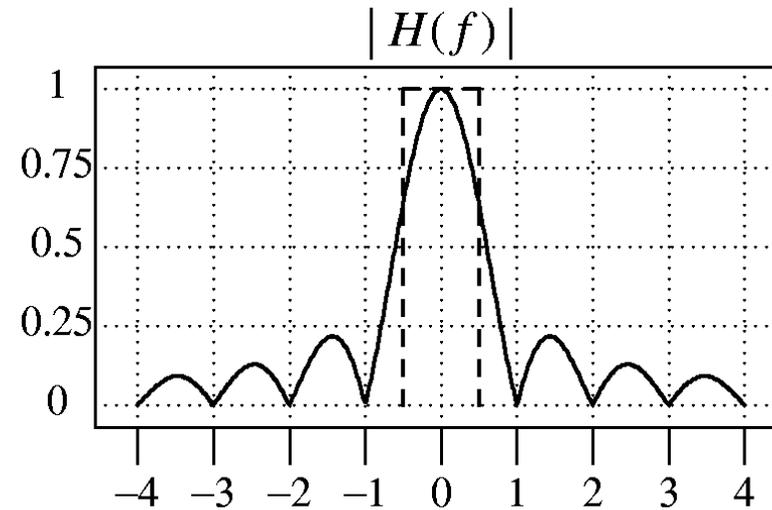
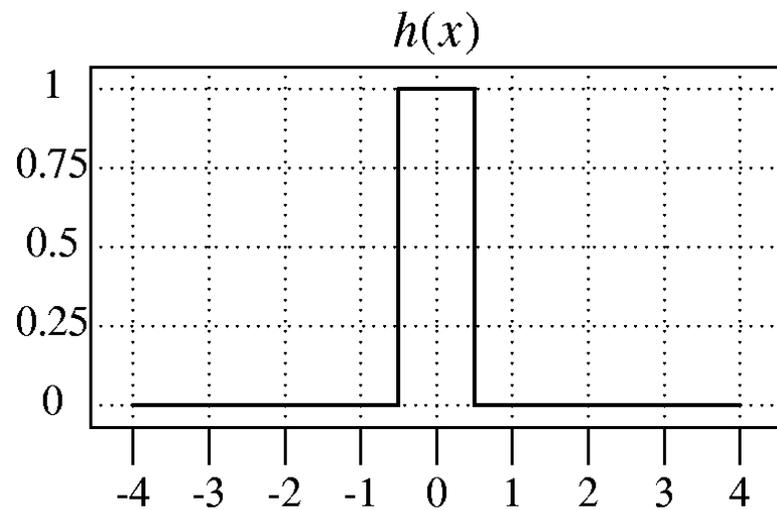
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Interpolation functions/kernels include:

- Box filter
- Triangle filter
- Cubic convolution
- Windowed sinc functions

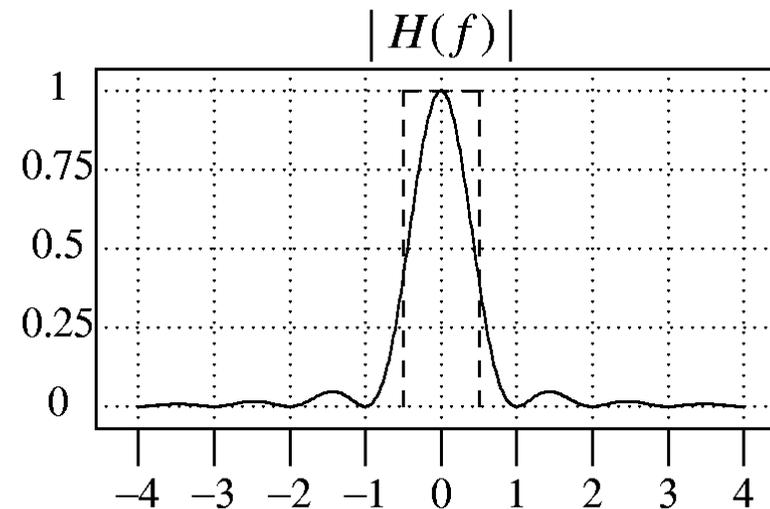
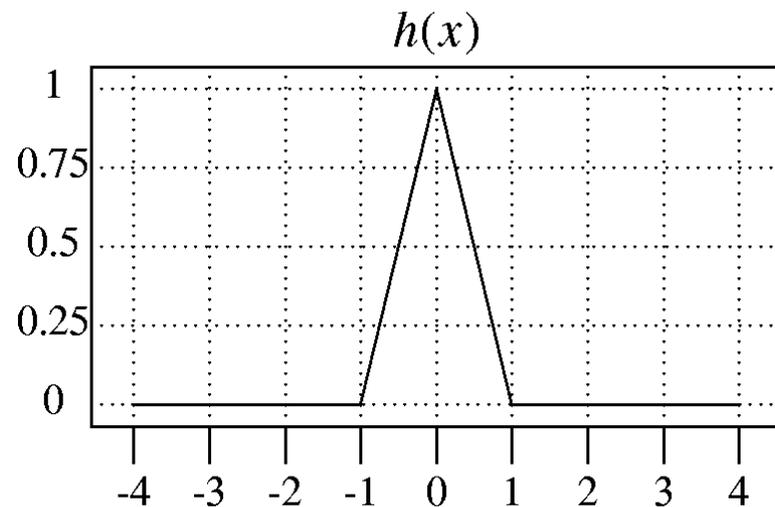
# Box Filter

- Nearest neighbor interpolation
- Blocky artifacts may occur



# Triangle Filter

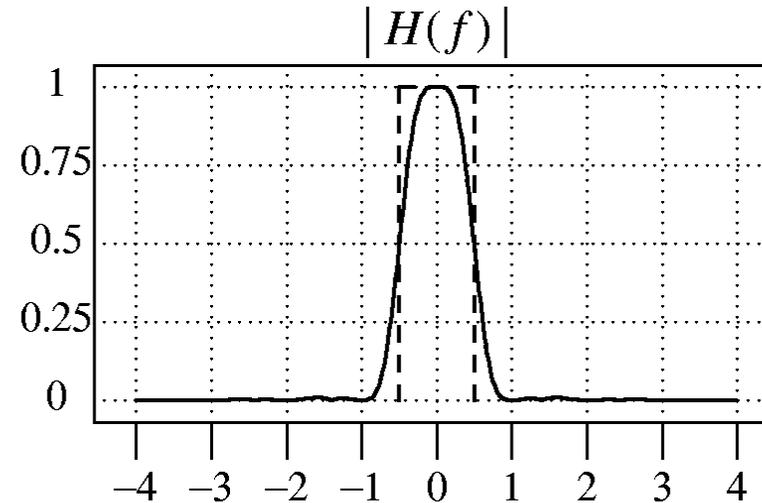
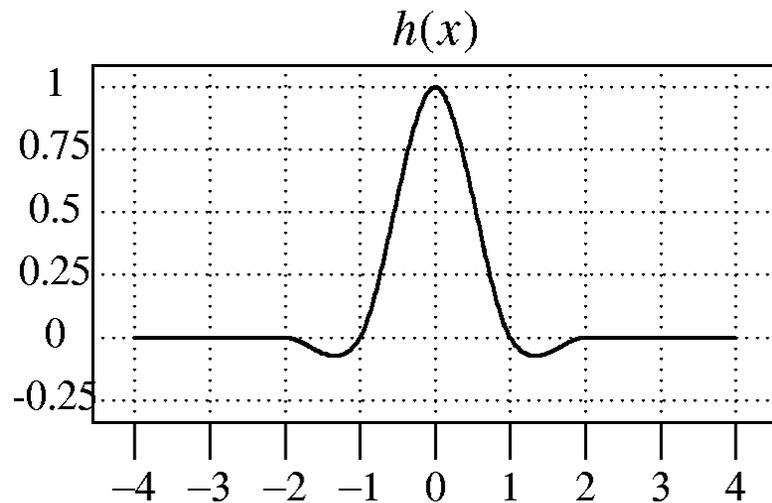
- Linear interpolation
- Popular for use with small deformations



# Cubic Convolution

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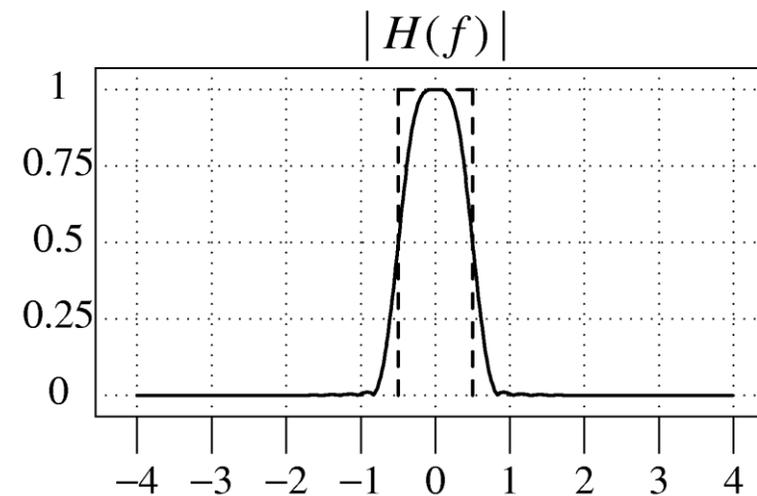
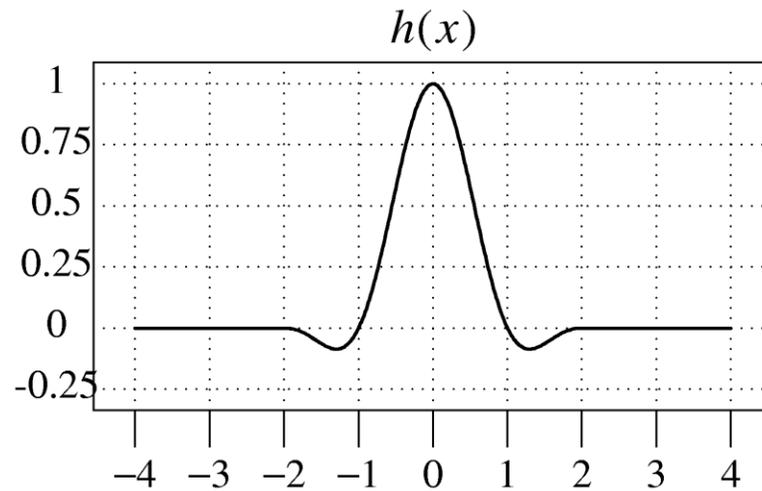
- Local cubic interpolation algorithm
- Advanced feature in digital cameras



# Windowed Sinc Function

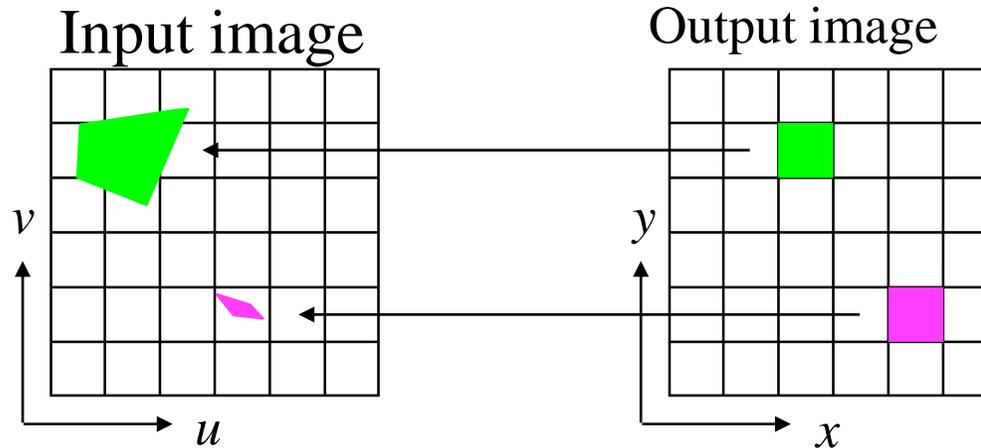
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- Smoothly tapered ideal sinc function



# Inverse Mapping

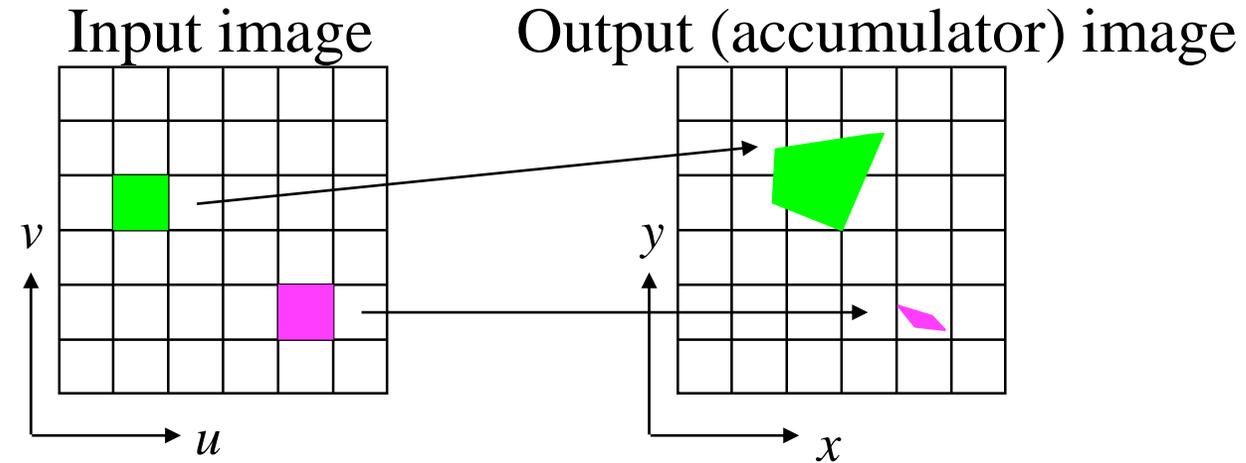
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- Visit output in scanline order
- Supersampling approximates area sampling
- Popular in computer graphics

# Forward Mapping

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- Visit input in scanline order
- Use output accumulator array
- 2D antialiasing is difficult
- Separable transforms facilitate efficient solution

# Separable Transforms

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$$[X(u, v), Y(u, v)] = F(u, v) \circ G(x, v)$$

- $F(u, v)$  is a row-preserving transformation that maps all input points to their final column positions, i.e.,  $[x, v]$ .
- $G(x, v)$  is a column-preserving transformation that maps the  $[x, v]$  points to their final row positions, i.e.,  $[x, y]$ .

# Catmull-Smith Algorithm

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- **First pass**

Maps image  $S(u,v)$  into intermediate image  $I(x,v)$

$$I(x,v) = S(X(u,v), v)$$

- **Second pass**

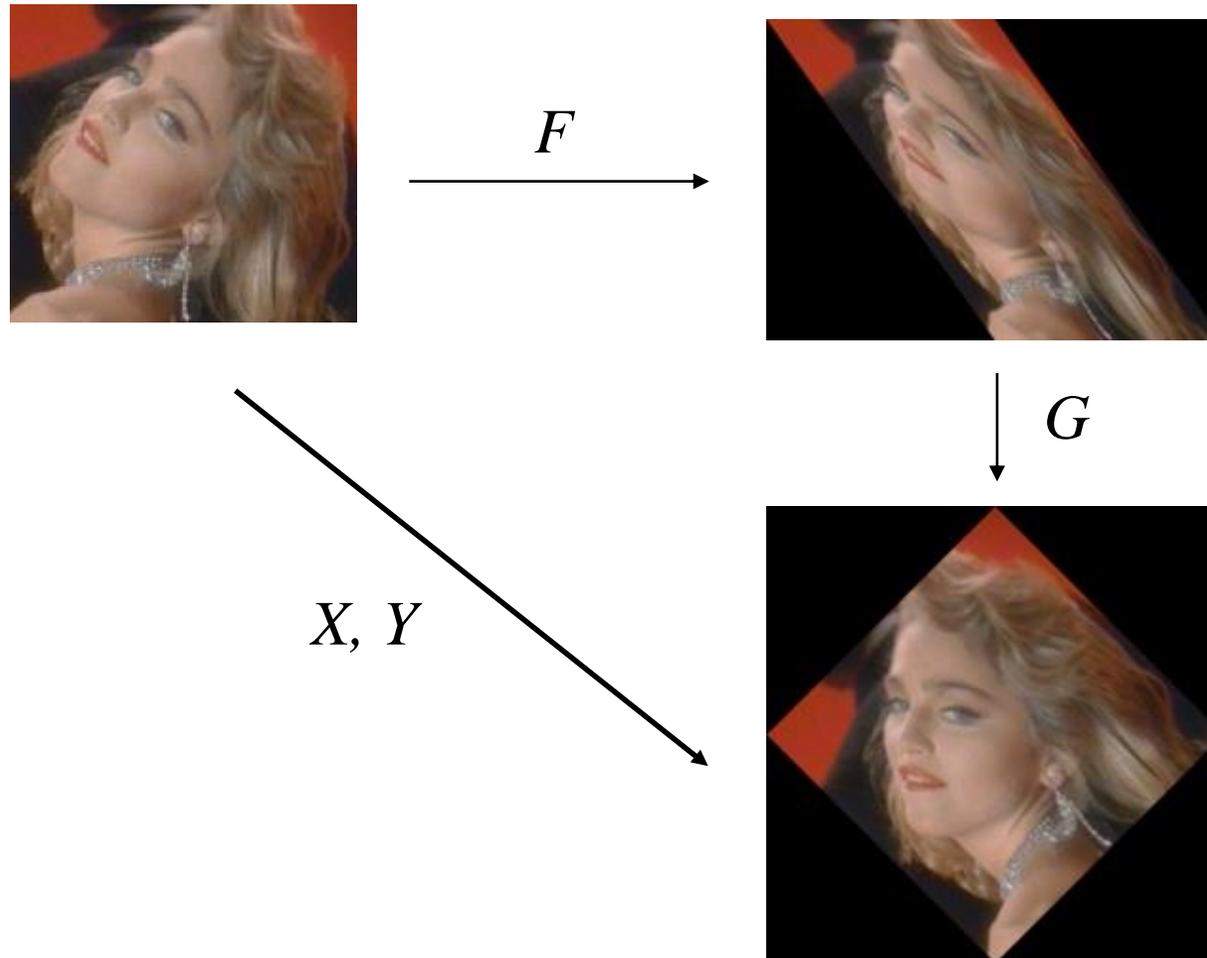
Maps  $I(x,v)$  into target image  $T(x,y)$

$$T(x,y) = I(x, Y(H_x(v), v))$$

where  $H_x$  is the solution to  $x=X(u,v)$  for  $u$

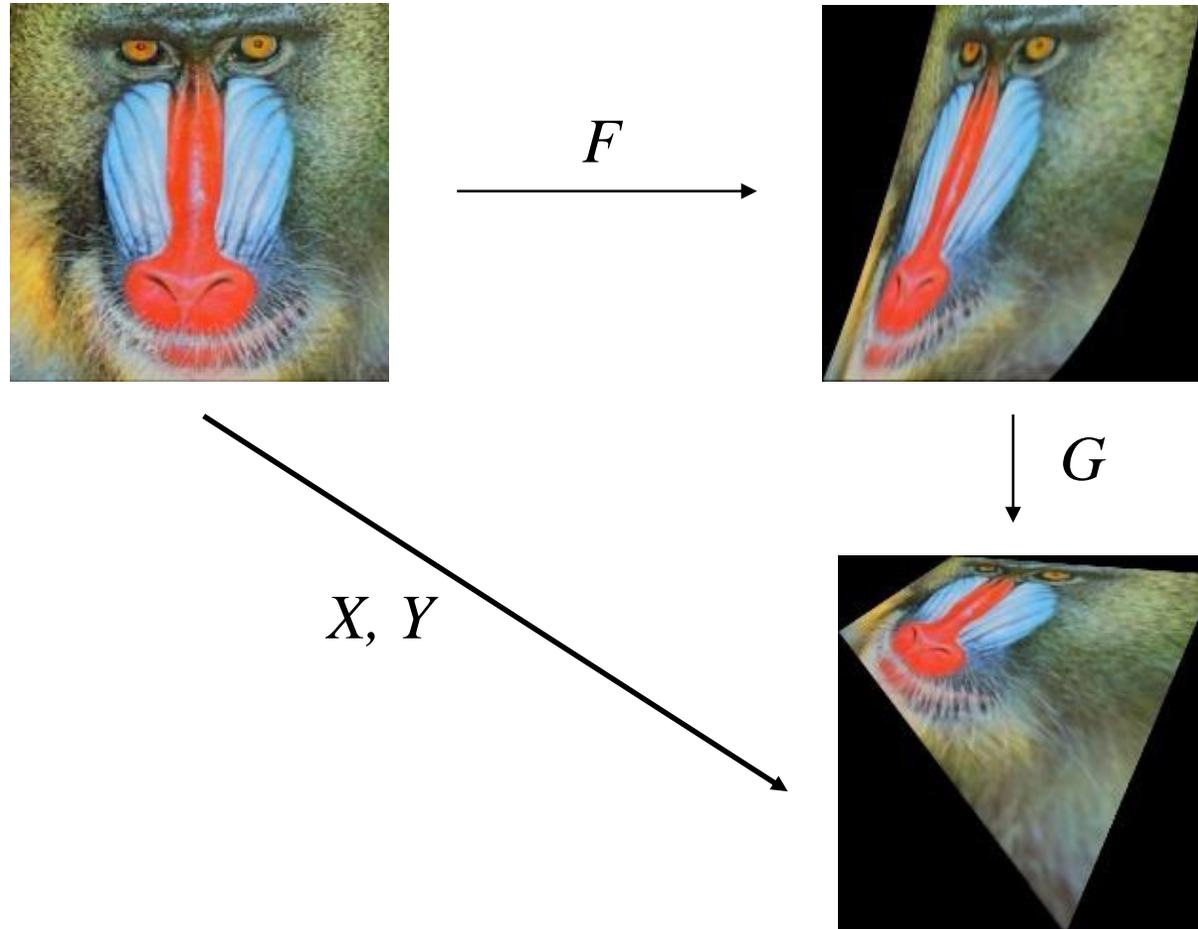
# 2-Pass Rotation

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# 2-Pass Perspective

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# Fant's Algorithm

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- Forward mapping intensity resampling
- Scanline order in input *and* output
- Amenable to hardware implementation

# Fant's algorithm: Example (1)

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$XLUT$	.6	2.3	3.2	3.3	3.9
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$YLUT$	100	106	115	120
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$I$	100	106	92	90
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$YLUT_x$	100	101	105	113
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$I_x$	40	101	106	82
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# Fant's algorithm: Example (2)

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$$I_x(0) = (100)((.4)) = 40$$

$$I_x(1) = \left[ (100) \left[ 1 - \frac{.4}{1.7} \right] + (106) \left[ \frac{.4}{1.7} \right] \right] ((1)) = 101$$

$$I_x(2) = \left[ (100) \left[ 1 - \frac{1.4}{1.7} \right] + (106) \left[ \frac{1.4}{1.7} \right] \right] ((.3)) + (106)((.7)) = 106$$

$$I_x(3) = \left[ (106) \left[ 1 - \frac{.7}{.9} \right] + (92) \left[ \frac{.7}{.9} \right] \right] ((.2)) + (92)((.1)) + (90)((.6)) = 82$$

# Bibliography

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- Catmull, E. and A.R. Smith, “*3-D Transformations of Images in Scanline Order*,” Proc. Siggraph ‘80, pp. 279-285, 1980.
- Fant, Karl M., “*A Nonaliasing, Real-Time Spatial Transform Technique*,” IEEE Computer Graphics and Applications, vol. 6, no. 3, pp. 71-80, 1986.
- Wolberg, George, *Digital Image Warping*, IEEE Computer Society Press, Los Alamitos, CA 1990.