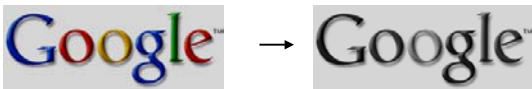
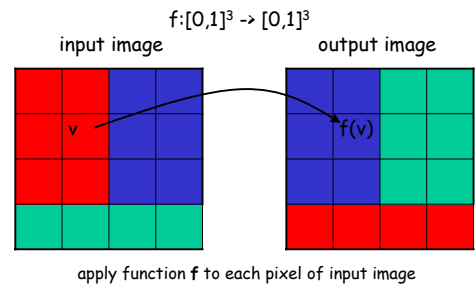


digital image processing

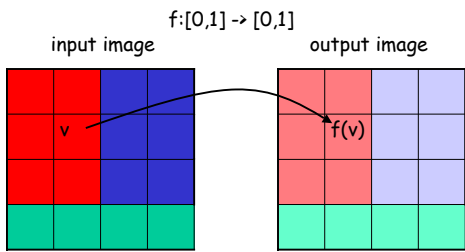
- simple pixel modification
- interpolation/extrapolation
- compositing
- convolution
- dithering
- warping
- morphing
- misc. effects

- **simple pixel modification**
- interpolation/extrapolation
- compositing
- convolution
- dithering
- warping
- morphing
- misc. effects



$$f(r,g,b) = .3r + .59g + .11b$$

simple pixel modification



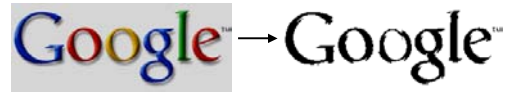
apply function f to each channel of each pixel of input image

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threshold



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threshold

if $v > t$ then $f(v)=1$
else $f(v)=0$

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9

invert



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invert

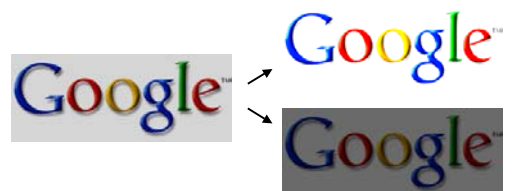
$f(v) = 1-v$

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brighten/darken



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brighten/darken

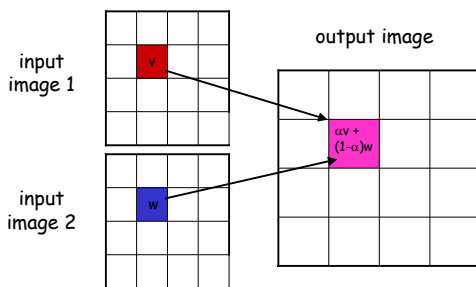
$$f(v) = \alpha v \text{ for } \alpha \geq 0$$

clamp to [0,1]

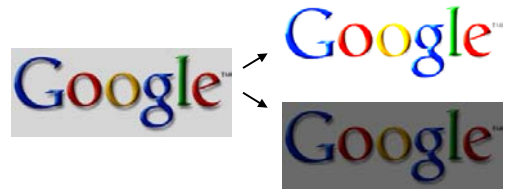
types of techniques

- simple pixel modification
- **interpolation/extrapolation**
- compositing
- convolution
- dithering
- warping
- morphing
- non-photo-realistic effects

interpolation/extrapolation



interpolation/extrapolation



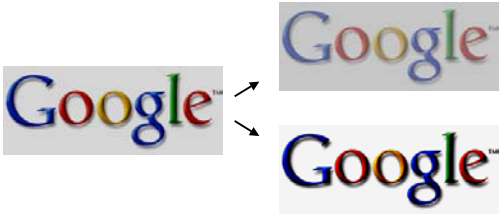
brighten/darken

interpolate/extrapolate image with

invert

interpolate/extrapolate image with

change contrast



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change contrast

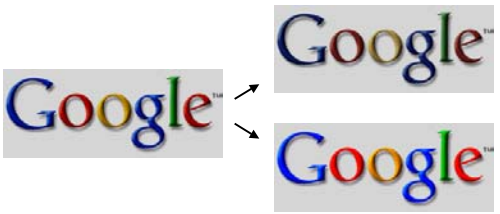
interpolate/extrapolate image with

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change saturation



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change saturation

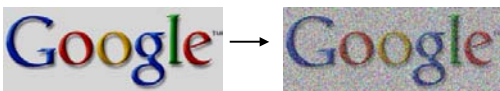
interpolate/extrapolate image with

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noisify



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noisify

interpolate/extrapolate with

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type of techniques

- simple pixel modification
- interpolation/extrapolation
- **compositing**
- convolution
- dithering
- warping
- morphing
- misc. effects

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compositing



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compositing

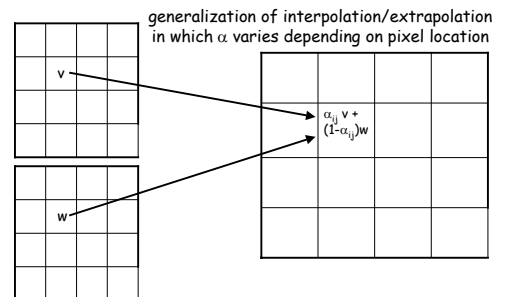


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compositing



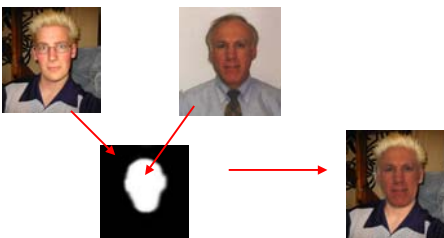
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compositing

typically $\alpha \in [0,1]$ so the array of α values can be represented by a single channel image called a *mask*



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type of techniques

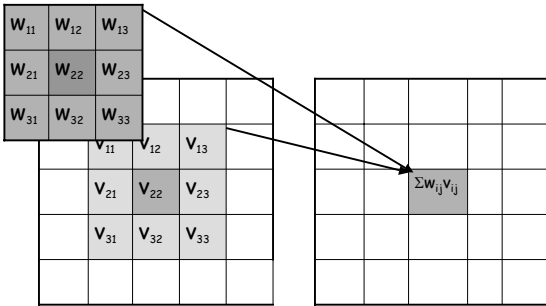
- simple pixel modification
- interpolation/extrapolation
- compositing
- **convolution**
- dithering
- warping
- morphing
- misc. effects

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convolution

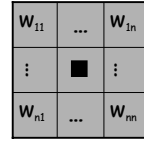


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kernel



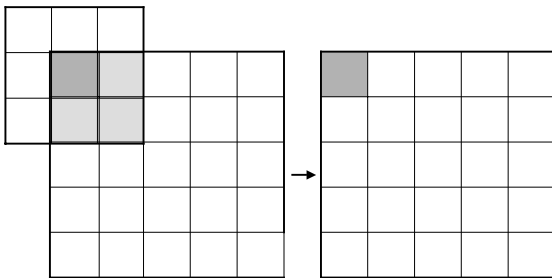
n odd

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boundaries?

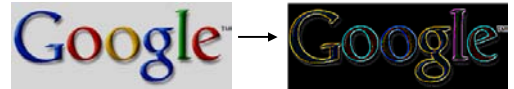


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edge detect



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edge detect kernel

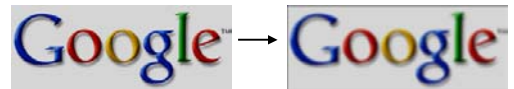
-1/8	-1/8	-1/8
-1/8	1	-1/8
-1/8	-1/8	-1/8

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blur



why blur?

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anti-aliasing



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3x3 box blur

1/9	1/9	1/9
1/9	1/9	1/9
1/9	1/9	1/9

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nXn box blur

w	...	w
⋮	■	⋮
w	...	w

$$w=1/n^2$$

why is it important that the sum of the weights is 1?

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separability

a kernel is separable if $W_{ij}=w_i w_j$

is the box filter separable?

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box blur vs. triangle blur



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3x3 triangle blur

1/16	1/8	1/16
1/8	1/4	1/8
1/16	1/8	1/16

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separability

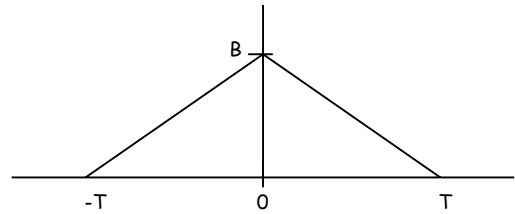
1/4	1/16	1/8	1/16
1/2	1/8	1/4	1/8
1/4	1/16	1/8	1/16
	1/4	1/2	1/4

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triangle function

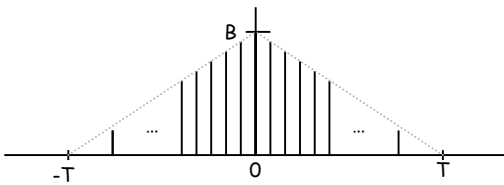


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discrete triangle



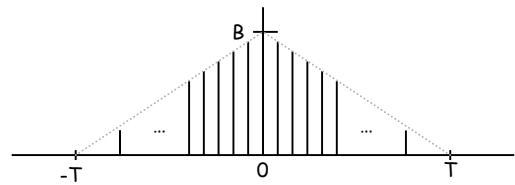
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normalized, discrete triangle

1. $T = (n+1)/2$ gives n non-zero samples
2. $\sum_{j=-T}^T f(j) = 1$ provided $B = 2/(n+1)$

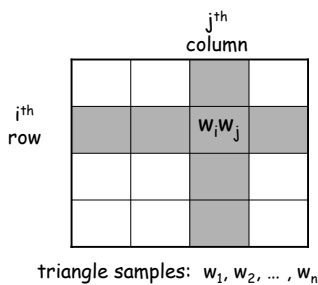


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triangle blur filter



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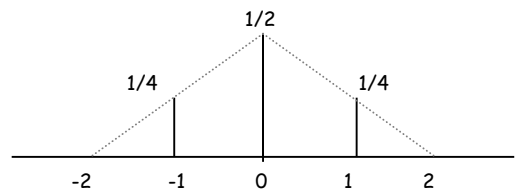
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example: $n=3$

$$T = (n+1)/2 = 2$$

$$B = 2/(n+1) = 1/2$$



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3x3 triangle blur filter

1/4	1/16	1/8	1/16
1/2	1/8	1/4	1/8
1/4	1/16	1/8	1/16
	1/4	1/2	1/4

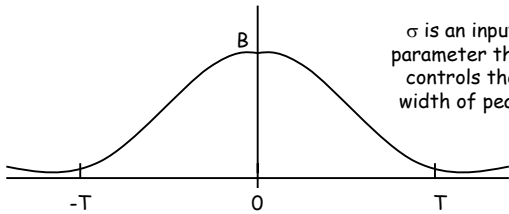
box, triangle and gaussian blurs



gaussian function

$$f(x) = Be^{-x^2/\sigma^2}$$

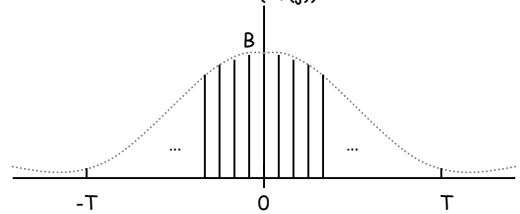
σ is an input parameter that controls the width of peak



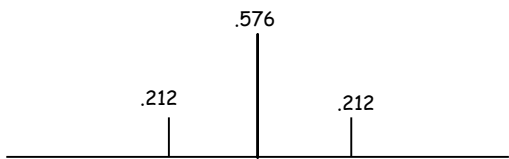
normalized, discrete version

$$T = (n+1)/2 \text{ gives } n \text{ samples}$$

$$B = 1/(\sum f(j))$$



example: $n=3, \sigma=1$



3x3 gaussian blur, $\sigma = 1$

.212	.045	.122	.045
.576	.122	.332	.122
.212	.045	.122	.045
	.212	.576	.212

type of techniques

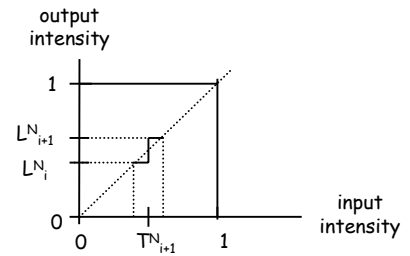
- simple pixel modification
- interpolation/extrapolation
- compositing
- convolution
- **dithering**
- warping
- morphing
- misc. effects

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N level uniform quantization

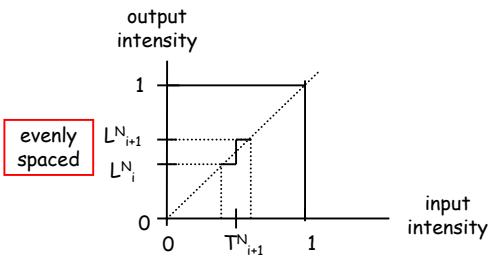


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N level uniform quantization

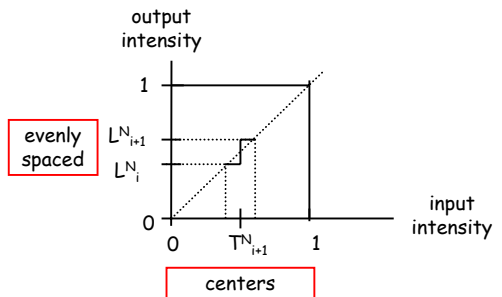


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N level uniform quantization



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quantization



8 bits per channel per pixel



1 bits per channel per pixel

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random dither

add noise to camouflage quantization artifacts



8 bits per channel per pixel



1 bits per channel per pixel



1 bits per channel per pixel noisy

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ordered dither



8 bits per channel
per pixel

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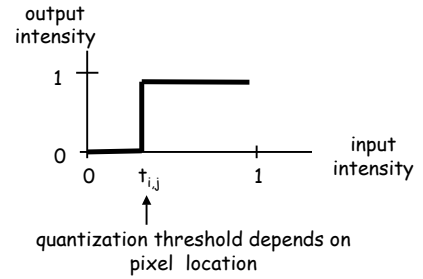
1 bits per channel
per pixel

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1 bits per channel
per pixel dithered

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ordered dither: 2 level output



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ordered dither

to simulate $M=m^2+1$ ($m \geq 1$) intensity levels:

- assign pixel locations to m^2 classes
- use T^M_i as threshold to quantize pixel in i^{th} class

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ordered dither: $m=2$

apply 2×2 mask
to classify pixel
locations

4	2	4	2	4	2	4
1	3	1	3	1	3	1
4	2	4	2	4	2	4
1	3	1	3	1	3	1
4	2	4	2	4	2	4

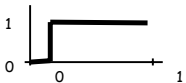
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ordered dither: $m=2$

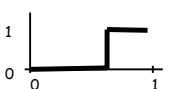
Class 1: $T^5_1=1/8$



Class 2: $T^5_2=3/8$



Class 3: $T^5_3=5/8$



Class 4: $T^5_4=7/8$

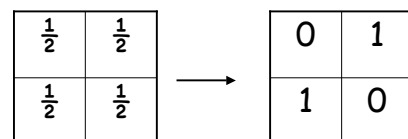


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ordered dither: example



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ordered dither: another view

add $\frac{1}{2} - T^M_i$ "noise" to pixel in class i then quantize

ordered dither

To simulate $M=m^2+1$ intensity levels:

- assign pixel locations to m^2 classes
- use T^M_i as threshold to quantize pixel in i^{th} class

how? answer: carefully

bayer's 2x2 ordered dither

4	2
1	3

bayer's 4x4 ordered dither matrix

15	8	14	6
4	12	2	10
13	5	0	7
1	9	3	11

error-diffusion dither



8 bits per channel per pixel

1 bits per channel per pixel

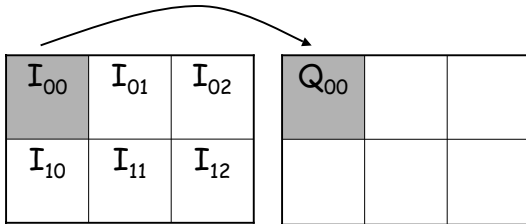
1 bits per channel per pixel dithered

error-diffusion dither

intuition

error diffusion dither

quantize I_{00} using uniform quantization



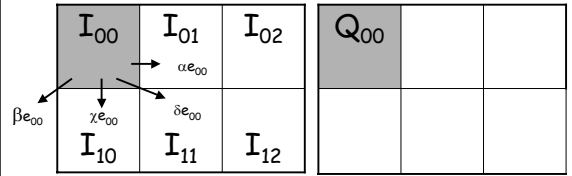
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error diffusion dither

distribute error $e_{00} = I_{00} - Q_{00}$ to neighbors not yet quantized



$$\alpha + \beta + \gamma + \delta = 1$$

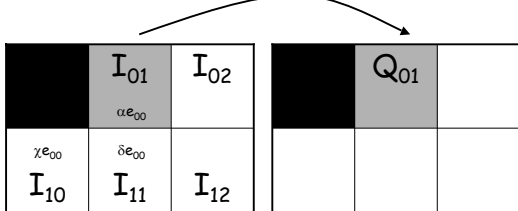
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error diffusion dither

quantize $I_{01} + \alpha e_{00}$



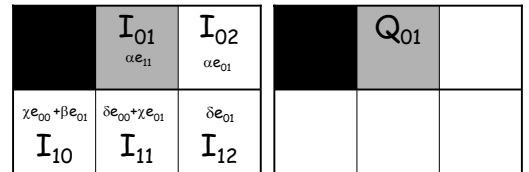
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error diffusion dither

distribute error: $e_{01} = I_{01} + \alpha e_{00} - Q_{01}$



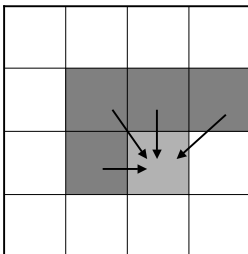
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error diffusion dither

error contributions by upper & left neighbors



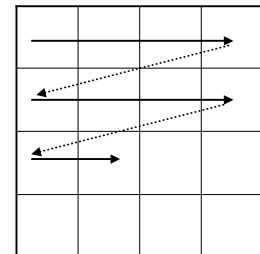
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error diffusion dither

order of quantization is important



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floyd-steinberg

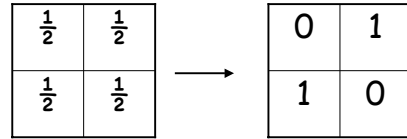
$$\alpha = 7/16$$

$$\beta = 3/16$$

$$\chi = 5/16$$

$$\delta = 1/16$$

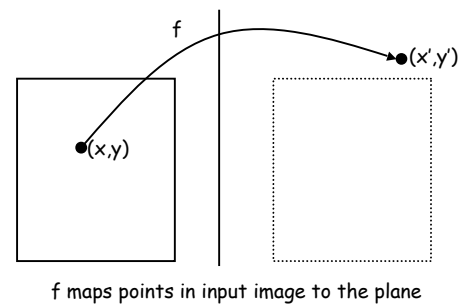
floyd-steinberg: example



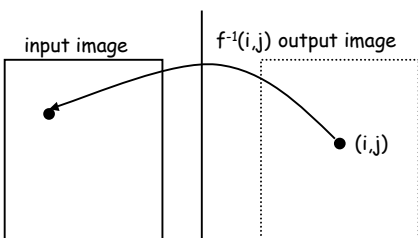
types of techniques

- simple pixel modification
- interpolation/extrapolation
- compositing
- convolution
- dithering
- **warping**
- morphing
- misc. effects

forward warp



forward warp



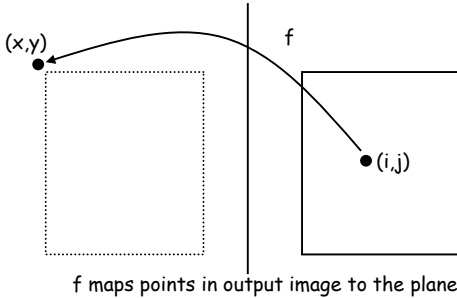
pixel at (i,j) in output image is assigned the value at location $f^{-1}(i,j)$ in input image

forward warp: problems

if f is not bijective

1. $f^{-1}(i,j)$ may not be defined
2. $f^{-1}(i,j)$ may not be unique

backward warp

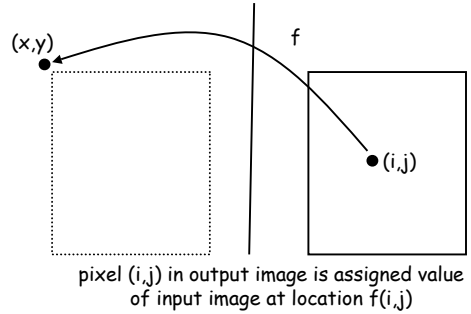


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backward warp



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backward warp: problems

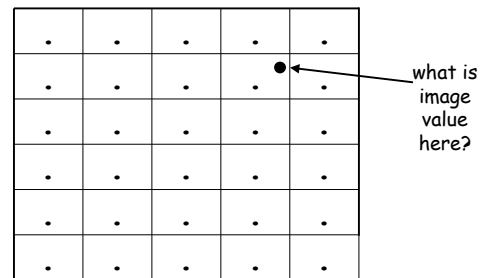
1. $f(i,j)$ may lie outside the input image area
solution: give image an infinite, black (or other default) border
2. $f(i,j)$ may not lie on a sample of the input image
solution: resample input

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re-sample



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re-sample

interpolate based on nearby samples

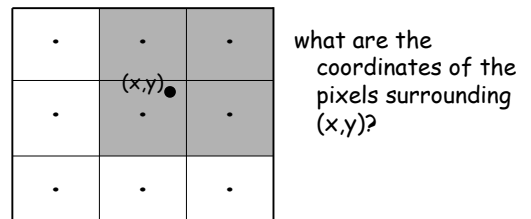
- nearest
- bilinear
- bicubic
- gaussian

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which way is up?

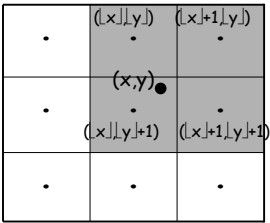


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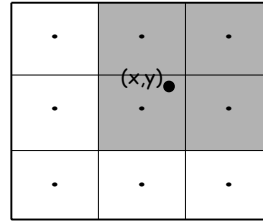
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which way is up?



what are the coordinates of the pixels surrounding (x,y) ?

nearest



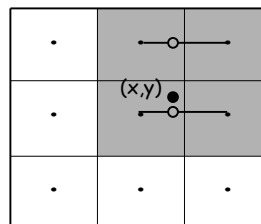
- compute distance between x,y and the locations of the neighboring samples
- set value at x,y to the value of the closest neighbor

re-sample

interpolate based on nearby samples

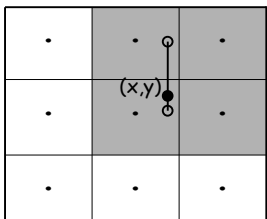
- nearest
- **bilinear**
- bicubic
- gaussian

bilinear interpolation



1. interpolate to find values at $(x,y-1)$ and $(x,y+1)$

bilinear interpolation



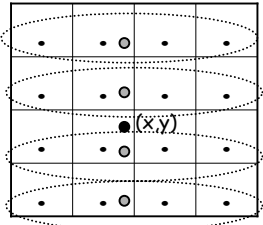
1. interpolate to find values at $(x,y-1)$ and $(x,y+1)$
2. interpolate to find value at x,y

re-sample

interpolate based on nearby samples

- nearest
- bilinear
- **bicubic**
- gaussian

bicubic



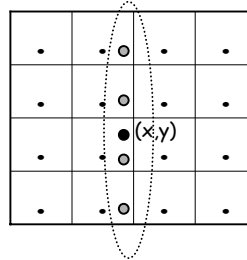
1. interpolate to find values at $(x, y, j+i)$

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bicubic



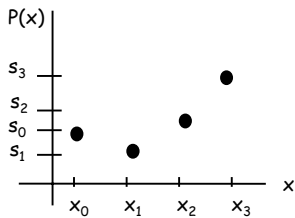
1. interpolate to find values at $(x, y, j+i)$
2. interpolate to find value at (x, y)

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bicubic: lagrangian



there is a unique cubic polynomial through any four distinct sample point

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lagrange cubic polynomial

$$P(x) = \sum_{i=0,1,2,3} s_i \prod_{j=0,1,2,3, j \neq i} (x-x_j)/(x_i-x_j)$$

exercise: what is the value of $P(x_i)$ $i=0,1,2,3$

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re-sample

interpolate based on nearby samples

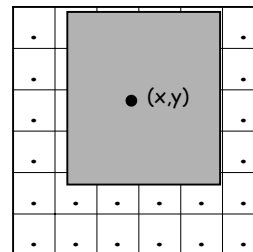
- nearest
- bilinear
- bicubic
- **gaussian**

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gaussian



interpolate nearby samples using normalized gaussian weights

unnormalized weight at (i, j) in window is $\exp[-((x-i)^2+(y-j)^2)/\sigma^2]$

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types of techniques

- simple pixel modification
- interpolation/extrapolation
- compositing
- convolution
- dithering
- warping
- **morphing**
- misc. effects

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morphing how to



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types of techniques

- simple pixel modification
- interpolation/extrapolation
- compositing
- convolution
- dithering
- warping
- morphing
- **non-photo-realistic effects**

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non-photo-realistic effects

- emboss
- cubism
- mosaic
- etc.

See photoshop,
gimp, or our
own ip for more
examples.

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