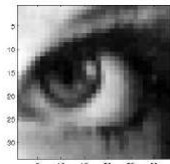
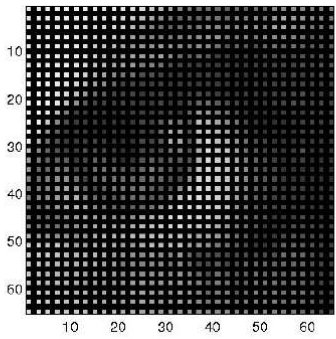




1

Image interpolation occurs in all digital images at some stage

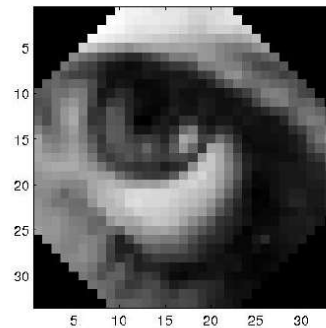
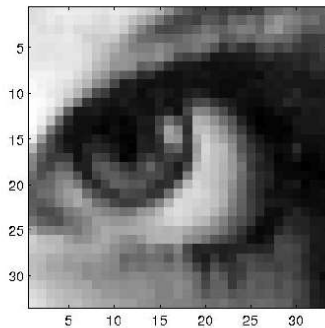
- Resizing (resampling)
- Remapping (geometrical transformations- rotation, change of perspective,...)
- Inpainting (restoration of *holes*)
- Morphing, nonlinear transformations

2

Image interpolation occurs in all digital images at some stage

- Resizing (resampling)
- Remapping (geometrical transformations- rotation, change of perspective,...)
- Inpainting (restauration of *holes*)
- Morphing, nonlinear transformations



3

Image interpolation occurs in all digital images at some stage

- Resizing (resampling)
- Remapping (geometrical transformations- rotation, change of perspective,...)
- Inpainting (restauration of *holes*)
- Morphing, nonlinear transformations



4

Image interpolation occurs in all digital images at some stage

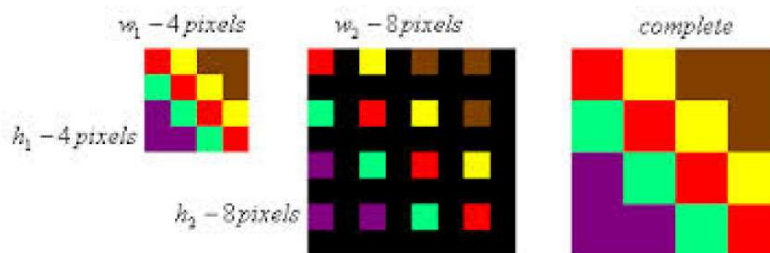
- Resizing (resampling)
- Remapping (geometrical transformations- rotation, change of perspective,...)
- Inpainting (restauration of *holes*)
- Morphing, nonlinear transformations



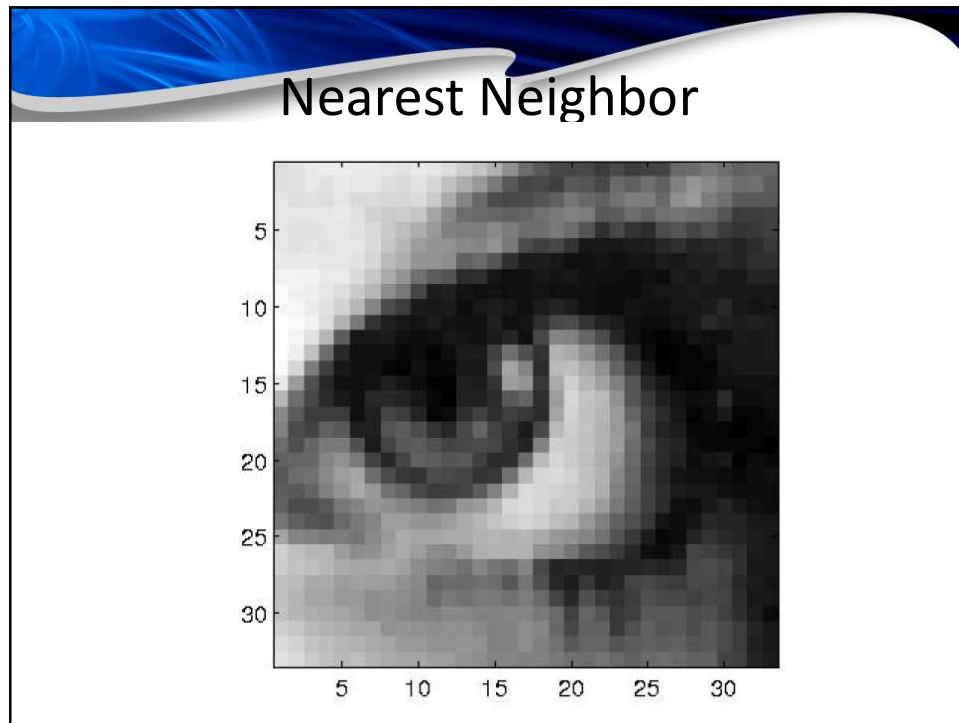
5

## Nearest Neighbor

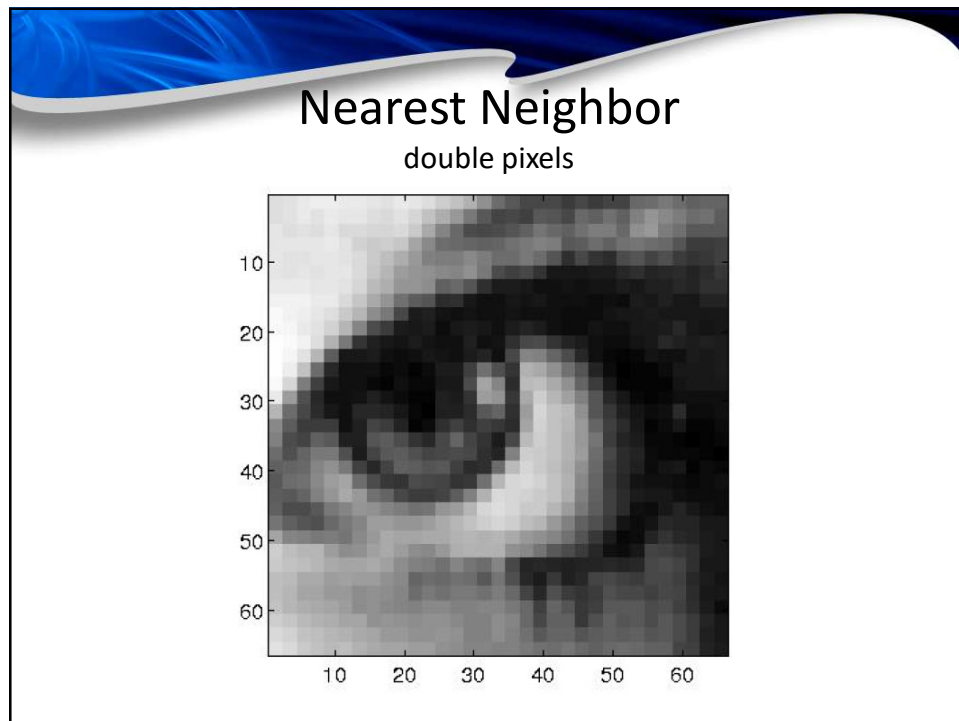
- Most basic method
- Requires the least processing time
- Only considers one pixel: the closest one to the interpolated point
- Has the effect of simply making each pixel bigger



6

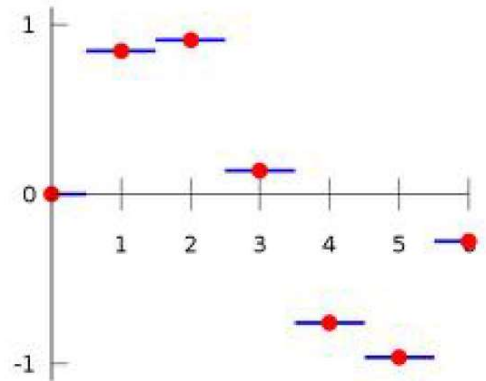


7



8

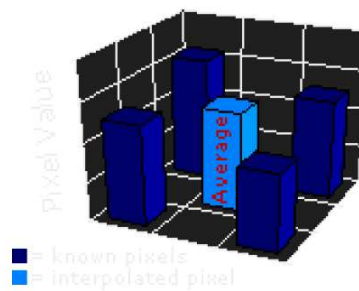
## Relationship with 1D interpolation



9

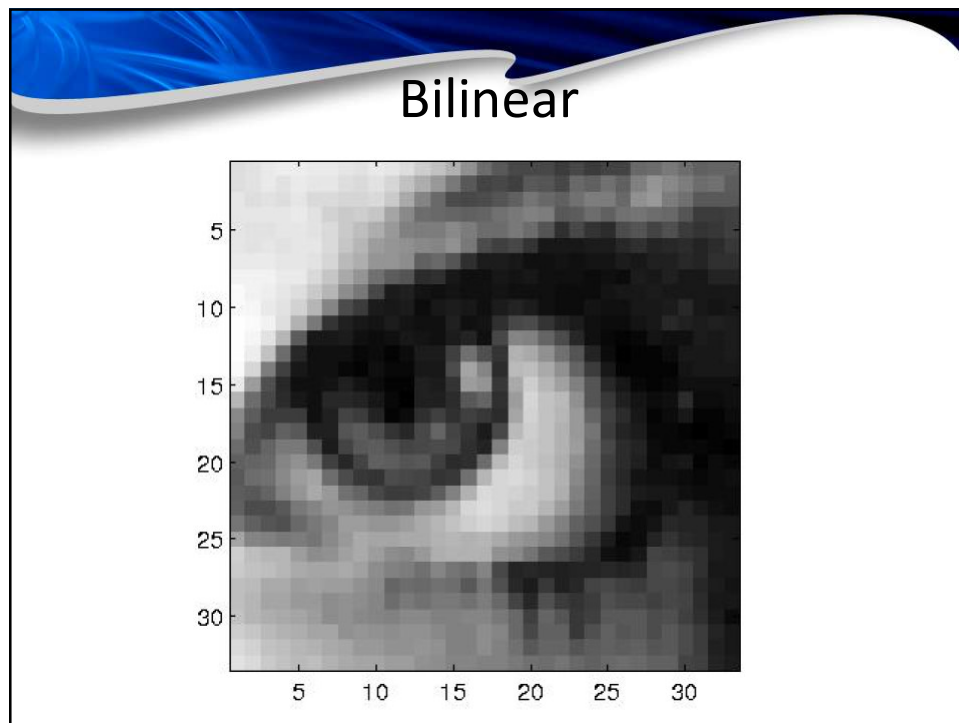
## Bilinear

- Considers the closest 2x2 neighborhood of known pixel values surrounding the unknown pixels
- Takes a weighted average of these 4 pixels to arrive at the final interpolated values
- Results in smoother looking images than nearest neighborhood
- Needs more processing time

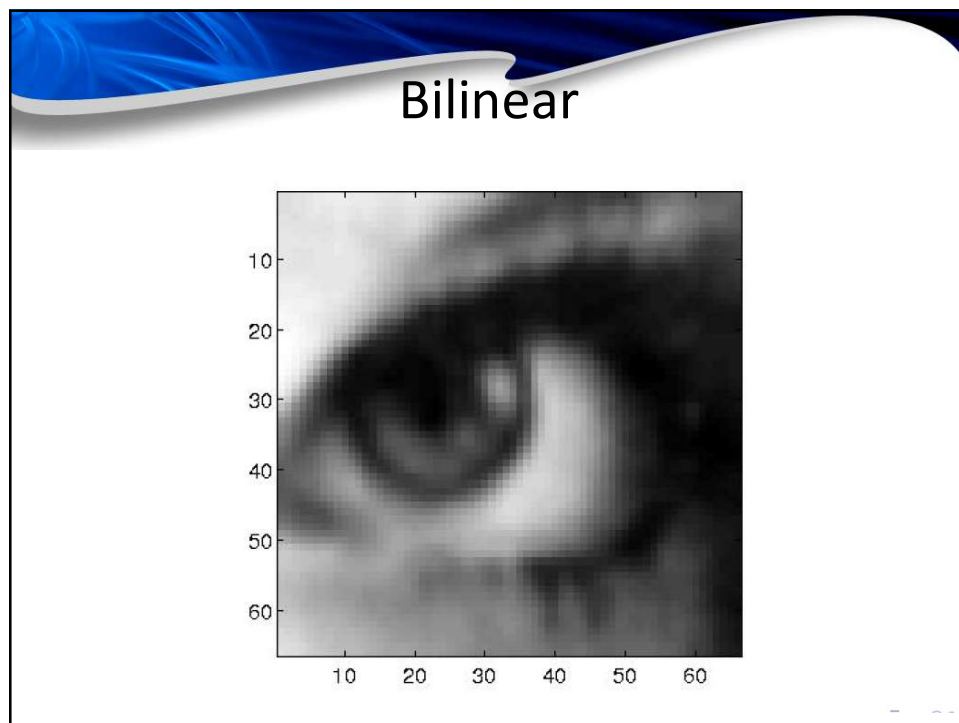


**Figure:** Case when all known pixel distances are equal. Interpolated value is simply their sum divided by four.

10



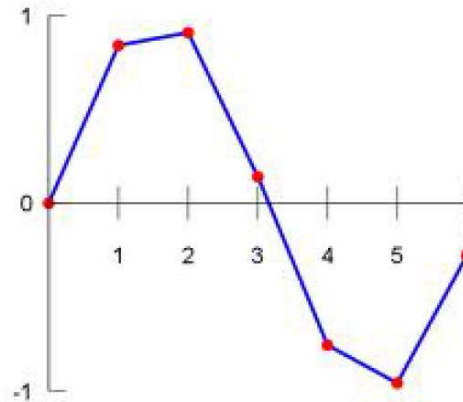
11



12



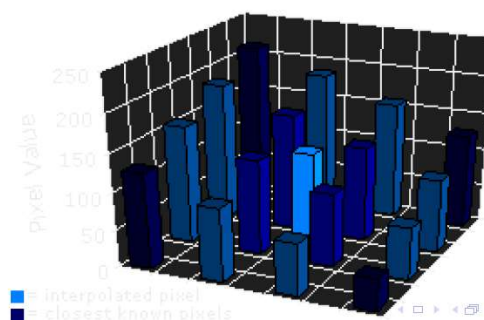
## Relationship with 1D interpolation



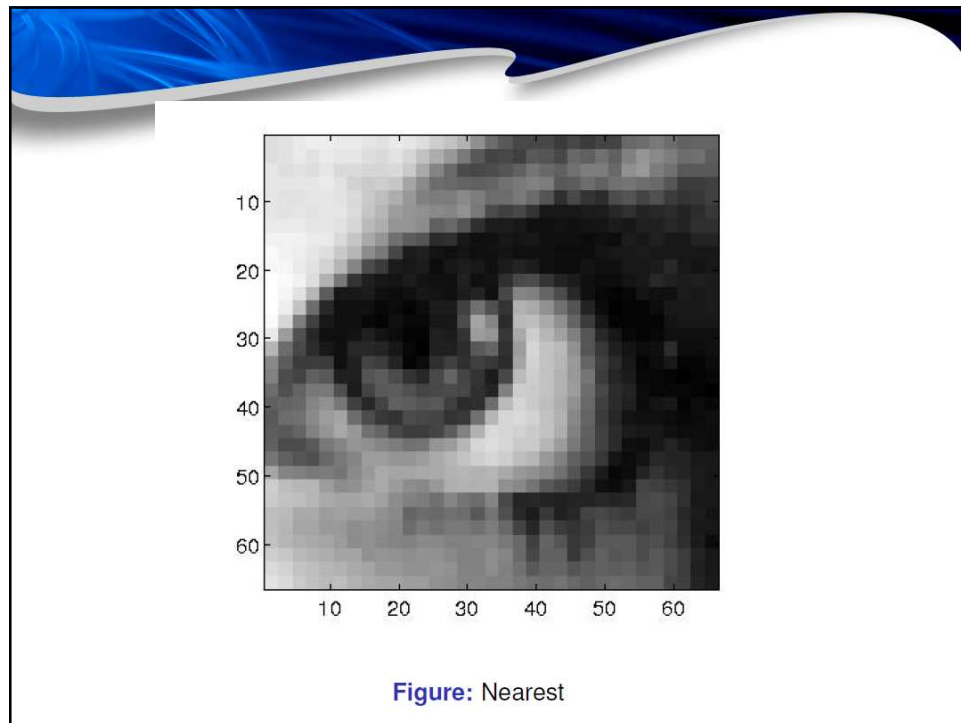
13

## Bicubic

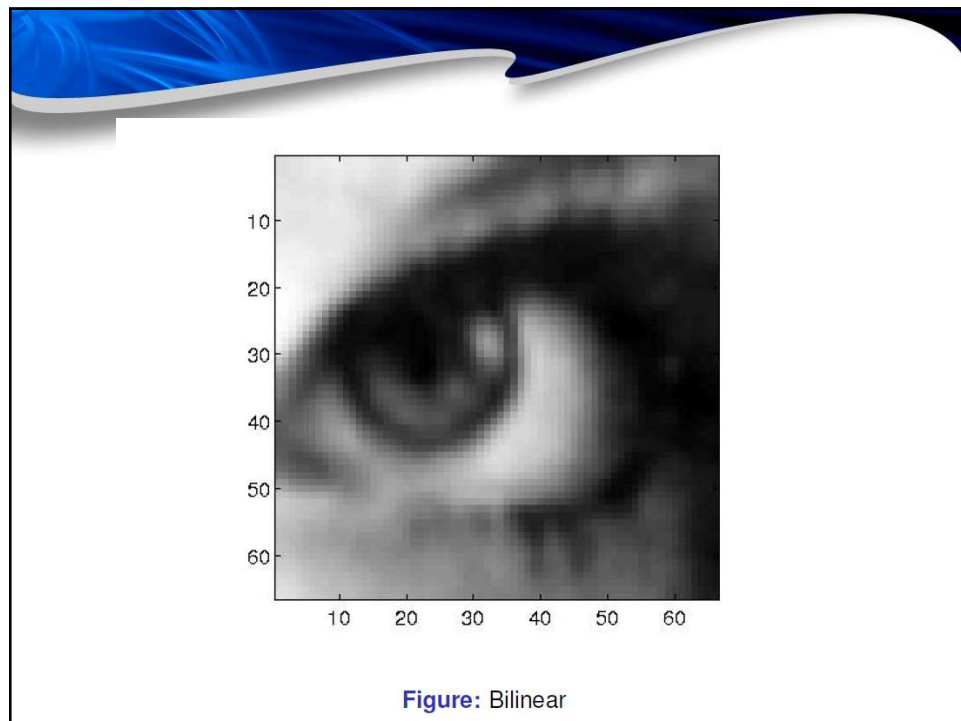
- One step beyond bilinear by considering the closest 4x4 neighborhood of known pixels, for a total of 16 pixels
- Since these are at various distances from the unknown pixel, closer pixels are given a higher weighting in the calculation
- Produces sharper images than the previous two methods.
- Good compromise between processing time and output quality
- Standard in many image editing programs, printer drivers and in-camera interpolation



14

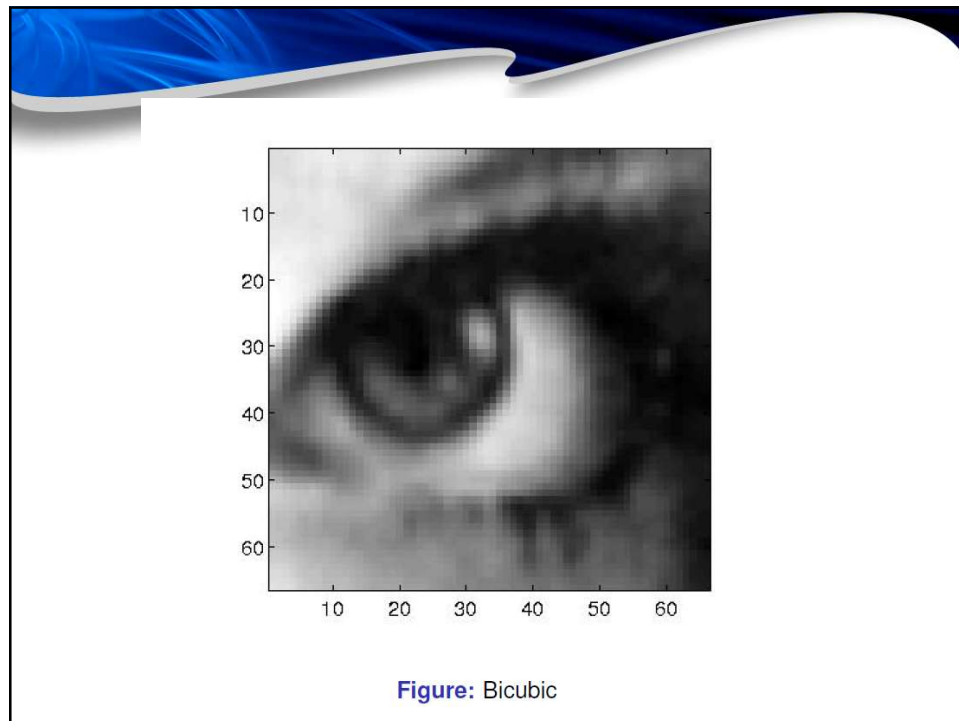


15

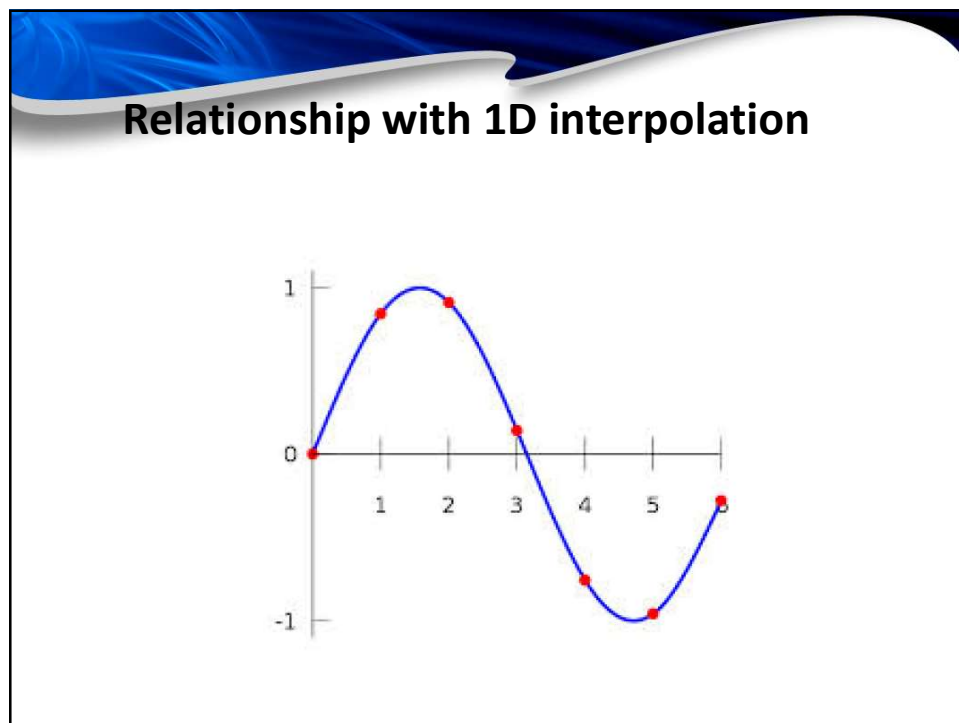


16



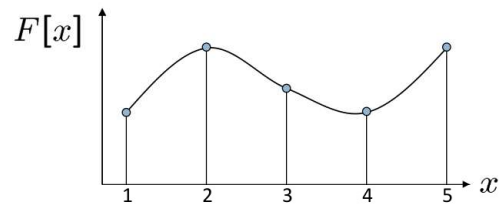


17



18

## Image interpolation



$d = 1$  in this example

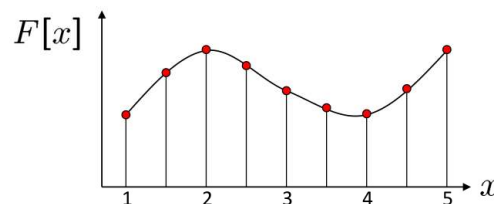
Recall how a digital image is formed

$$F[x, y] = \text{quantize}\{f(xd, yd)\}$$

- It is a discrete point-sampling of a continuous function
- If we could somehow reconstruct the original function, any new image could be generated, at any resolution and scale

19

## Image interpolation



$d = 1$  in this example

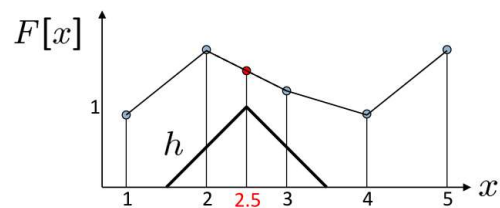
Recall how a digital image is formed

$$F[x, y] = \text{quantize}\{f(xd, yd)\}$$

- It is a discrete point-sampling of a continuous function
- If we could somehow reconstruct the original function, any new image could be generated, at any resolution and scale

20

## Image interpolation



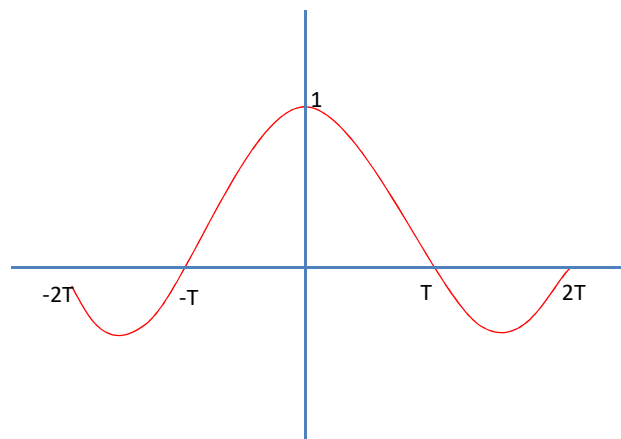
$d = 1$  in this example

- What if we don't know  $f$  ?
  - Guess an approximation:  $\tilde{f}$
  - Can be done in a principled way: filtering
  - Convert  $F$  to a continuous function:
 
$$f_F(x) = F\left(\frac{x}{d}\right) \text{ when } \frac{x}{d} \text{ is an integer, } 0 \text{ otherwise}$$
  - Reconstruct by convolution with a *reconstruction filter*,  $h$ 

$$\tilde{f} = h * f_F$$

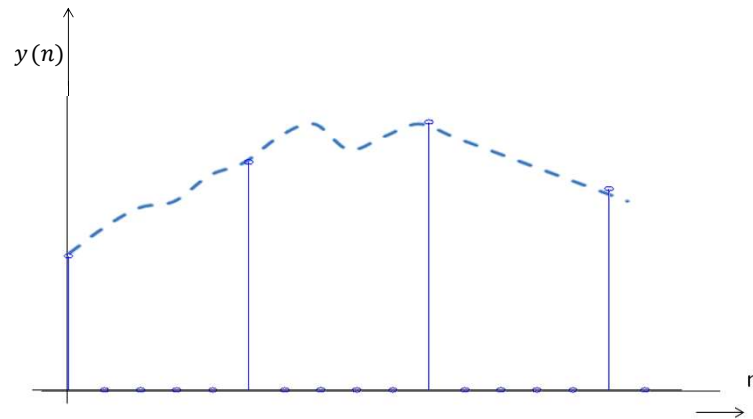
21

## Bicubic Interpolation

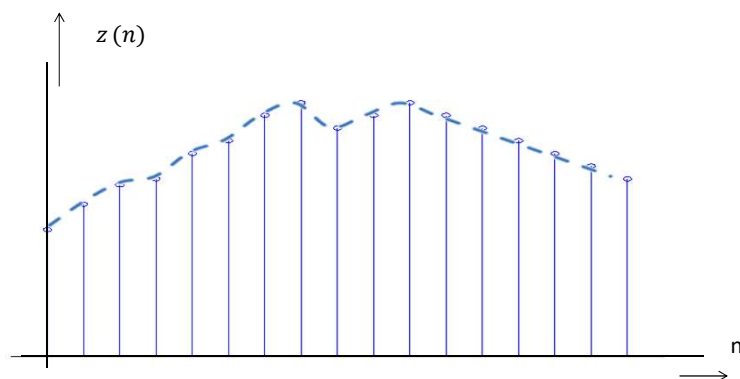


22

## Bicubic Interpolation

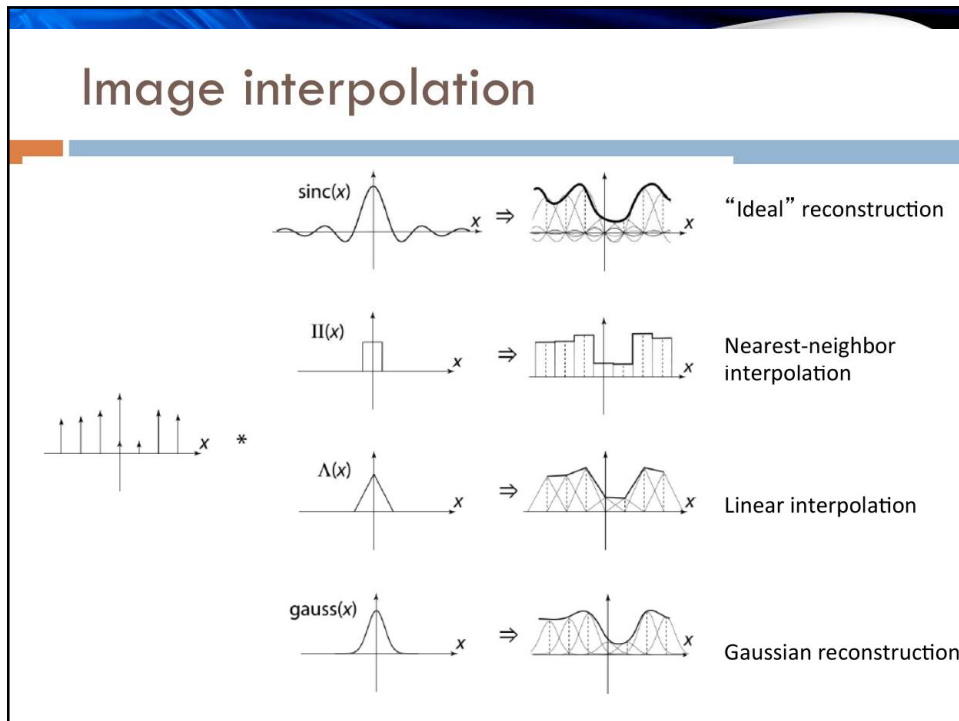


23



24

# Image interpolation



25

## Another example

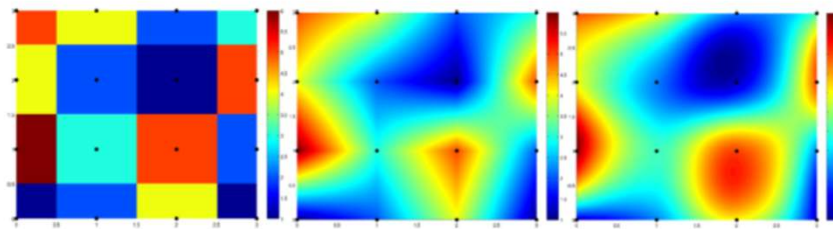
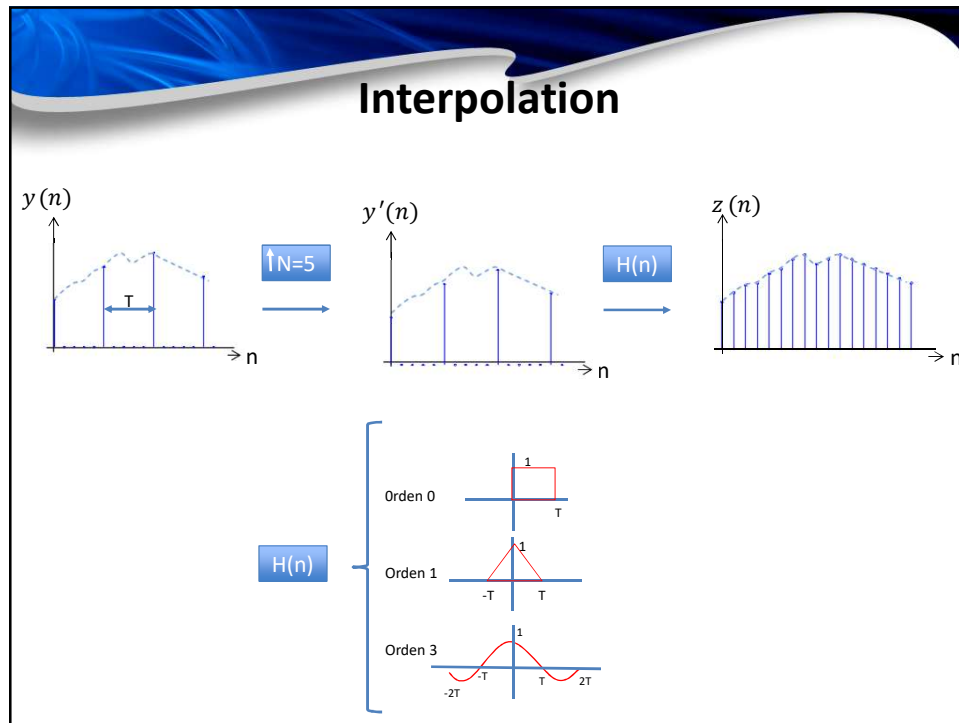
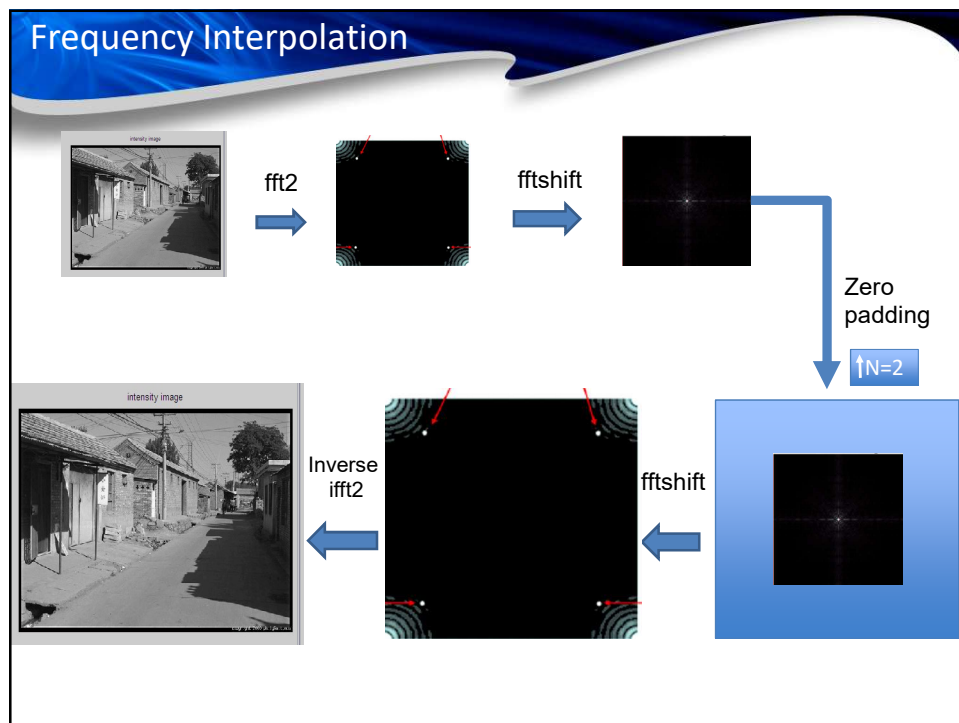


Figure: Nearest, bilinear and bicubic interpolations

26



27



28



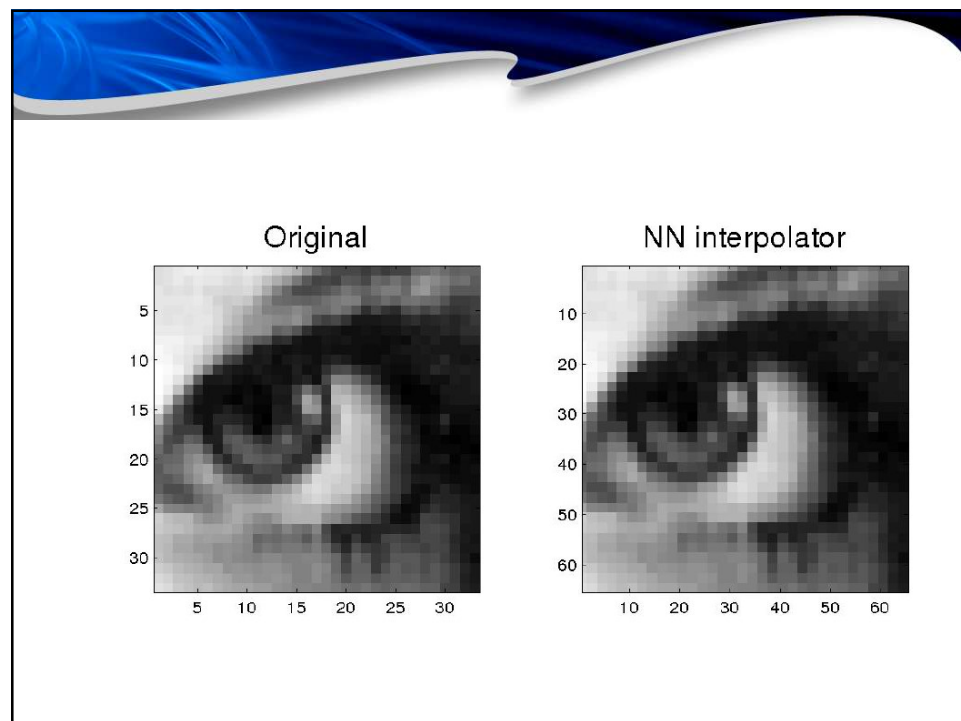
## Matlab-generic interpolation

```

1 clear all
2 I=imread('lena_eye.png');
3 I=double(I);
4
5 [m n]= size(I);
6 [x,y] = meshgrid(1:n, 1:m);           % grid of input image
7
8 r=0.5;                                % scale factor
9 [p,q]=meshgrid(1:r:n, 1:r:m);         % grid for output image
10 I2=interp2(x,y,I,p,q,'nearest');      % interpolation
11                                       % 'nearest', ...
12                                       % 'bilinear','bicubic'
13
14 figure
15 subplot(1,2,1), imagesc(I), axis image
16 title('Original','FontSize',18)
17 subplot(1,2,2), imagesc(I2), axis image
18 title('NN interpolator','FontSize',18)
19 colormap(gray)
20 print -djpeg eye_ori_NN.jpg

```

29



30

## Image interpolation-Direct commands

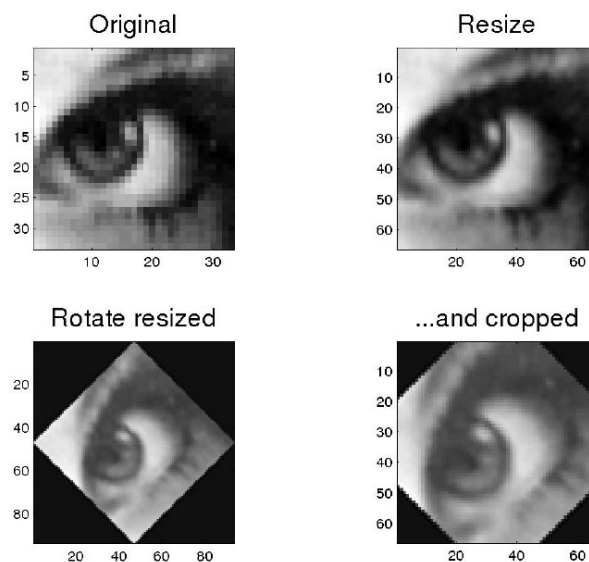
```

1 clear all
2 I=imread('lena_eye.png');
3 I=double(I);
4
5 r=2;theta=45;
6 I2=imresize(I,r,'bicubic');           % resize by factor r
7 I3=imrotate(I2,theta,'bicubic');      % rotate theta degrees
8 I4=imrotate(I2,theta,'bicubic','crop'); % 'crop' -> original size
9
10 figure
11 subplot(2,2,1),imagesc(I),axis image
12 title('Original','FontSize',18)
13 subplot(2,2,2),imagesc(I2),axis image
14 title('Resize','FontSize',18)
15 subplot(2,2,3),imagesc(I3),axis image
16 title('Rotate resized','FontSize',18)
17 subplot(2,2,4),imagesc(I4),axis image
18 title('...and cropped','FontSize',18)
19 colormap(gray)
20
21 print -djpeg eye_several.jpg

```

31

## Transformations



32

## Affine transformations

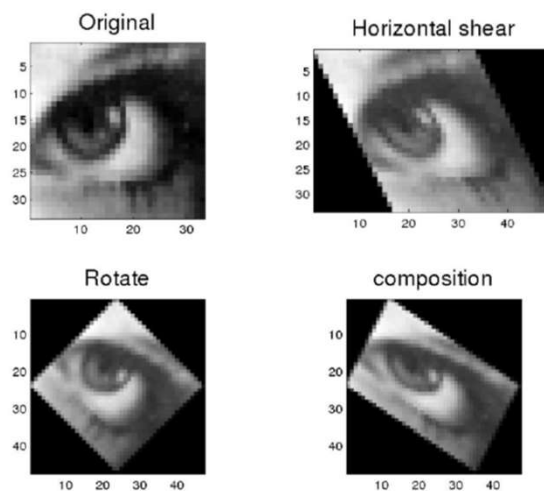
```

1 clear all
2 I=imread('lena_eye.png');
3 I=double(I);
4
5 tform2 = maketform('affine',[1 0 0; .5 1 0; 0 0 1]);           % ...
6 I2 = imtransform(I,tform2);                                     % ...
7
8 theta=pi/4;                                                    % ...
9 A=[cos(theta) sin(theta) 0; -sin(theta) cos(theta) 0; 0 0 1]; % ...
10 tform3 = maketform('affine',A);
11 I3 = imtransform(I,tform3);
12
13 tform4 = maketform('composite',[tform2,tform3]);              % ...
14 I4 = imtransform(I,tform4);
15
16 figure
17 subplot(2,2,1),imagesc(I),axis image
18 title('Original','FontSize',18)
19 subplot(2,2,2),imagesc(I2),axis image

```

33

## Affine Transformations



34