

## uniform quantization: N levels

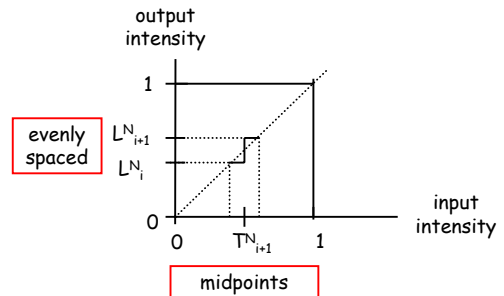
- output levels:  
evenly spaced
- thresholds:  
midpoints

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77

## N level uniform quantization



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78

## uniform quantization: N level

- output levels:  
 $L_i^N = i/(N-1), i = 0, \dots, N-1$
- thresholds:  
 $T_i^N = (L_{i-1}^N + L_i^N)/2 = (2i-1)/2(N-1), i = 1, \dots, N-1$

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## quantization error



8 bits per channel  
per pixel



1 bits per channel  
per pixel

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## dithering

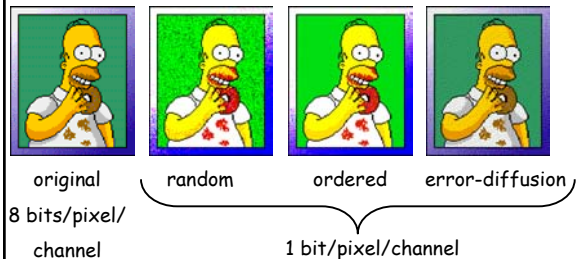
- technique for camouflaging error
- algorithms
  - random
  - ordered
  - error diffusion

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## comparison



original  
8 bits/pixel/  
channel

random

ordered

error-diffusion

1 bit/pixel/channel

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82

## random dither

add noise to camouflage quantization artifacts



8 bits/pixel/channel

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1 bits/pixel/channel

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1 bits/pixel/channel  
dithered

83

## random dither

for each pixel in the input image  
add random noise to pixel value  
uniformly quantize new value

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84

## random dither

add noise to camouflage quantization artifacts



8 bits/pixel/channel

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1 bits/pixel/channel

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1 bits/pixel/channel  
dithered

85

## ordered dither

add pseudo-random noise to camouflage quantization artifacts



8 bits/pixel/channel

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1 bits/pixel/channel

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1 bits/pixel/channel  
dithered

86

## ordered dither intuition: 2 level output

suppose all 2x2  
neighborhoods  
were uniform

.2	.2	.6	.6	.3	.3
.2	.2	.6	.6	.3	.3
.4	.4	.9	.9	.2	.2
.4	.4	.9	.9	.2	.2

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## 2 level output: quantized blocks

every neighborhood is quantized in one of two ways

0	0	1	1
0	0	1	1

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## ordered dither intuition: 2 level output

suppose all  $2 \times 2$  neighborhoods were uniform  
we could quantize neighborhoods together

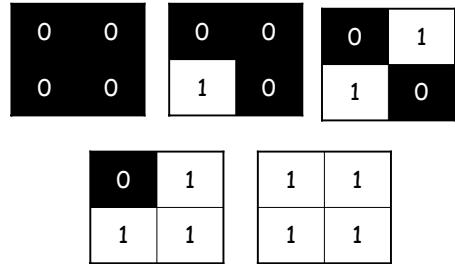
.2	.2	.6	.6	.3	.3
.2	.2	.6	.6	.3	.3
.4	.4	.9	.9	.2	.2
.4	.4	.9	.9	.2	.2

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## neighborhood blocks

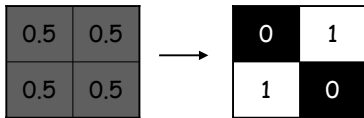


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90

## intuition



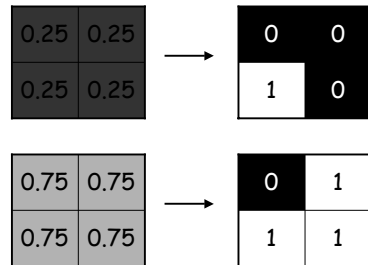
try to preserve average intensity over neighborhoods

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91

## more intuition

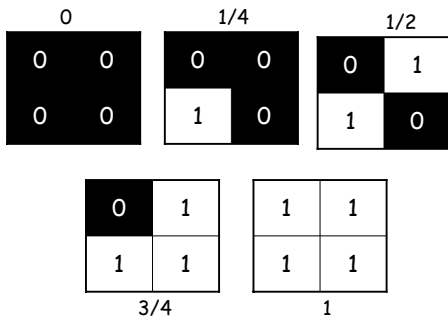


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92

## average intensity simulates 5 output levels

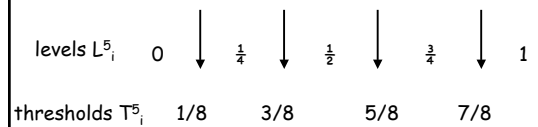


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93

## midpoint thresholds for 5 output levels



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94

## quantization

.2	.2	.6	.6	.3	.3
.2	.2	.6	.6	.3	.3
.4	.4	.9	.9	.2	.2
.4	.4	.9	.9	.2	.2

→

0	0	0	1	0	0
1	0	1	1	1	0
0	1	1	1	0	0
1	0	1	1	1	0

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## but we don't have uniform neighborhoods...

0.32	0.57
0.97	0.21

→ ?

or do we?

image coherence

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## ordered dither intuition

D	B
A	C

choose thresholds for each neighborhood position that preserve, as well as possible, average intensity over uniform neighborhoods

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## ordered dither: step 1

determine pixel location in neighborhood

4	2	4	1	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

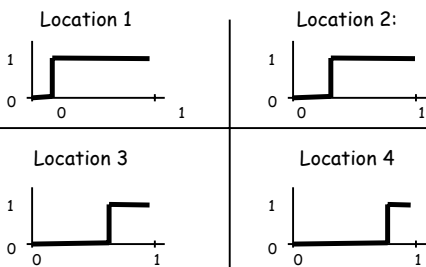
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## ordered dither: step 2

quantize based on threshold for pixel location



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## 5 simulated output levels

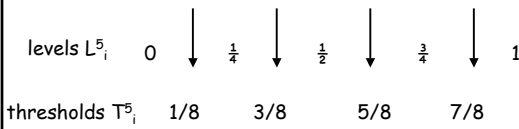
0	1/4	1/2												
<table border="1"><tr><td>0</td><td>0</td></tr><tr><td>0</td><td>0</td></tr></table>	0	0	0	0	<table border="1"><tr><td>0</td><td>0</td></tr><tr><td>1</td><td>0</td></tr></table>	0	0	1	0	<table border="1"><tr><td>0</td><td>1</td></tr><tr><td>1</td><td>0</td></tr></table>	0	1	1	0
0	0													
0	0													
0	0													
1	0													
0	1													
1	0													
<table border="1"><tr><td>0</td><td>1</td></tr><tr><td>1</td><td>1</td></tr></table>	0	1	1	1	<table border="1"><tr><td>1</td><td>1</td></tr><tr><td>1</td><td>1</td></tr></table>	1	1	1	1					
0	1													
1	1													
1	1													
1	1													
3/4	1													

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## midpoint thresholds for 5 output levels



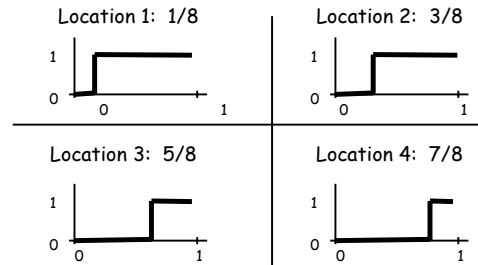
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## thresholds

threshold for location  $i$ :  $T_i^5 = (2i-1)/8, i = 1, \dots, 4$



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## ordered dither recap: step 1

determine pixel location in neighborhood

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

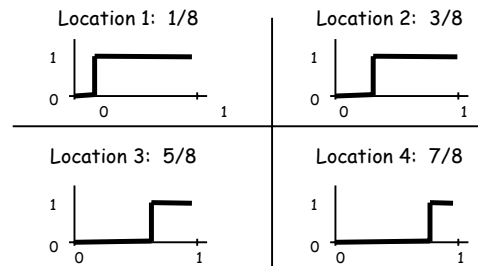
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## ordered dither recap: step 2

quantize based on threshold  $T_i^5$  for pixel location  $i$



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104

## ordered dither

- **another view**
  - easier to implement in ip framework
- **generalizations**
  - simulate more output levels
  - use more bits/pixel/channel

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## ordered dither

1. determine pixel location in neighborhood
- |   |   |   |
|---|---|---|
| 4 | 2 | 4 |
| 1 | 3 | 1 |
| 4 | 2 | 4 |
2. quantize using threshold  $T_i^5$  for pixel in location  $i$
  2. add  $\frac{1}{2} - T_i^5$  "noise" to pixel value in location  $i$  then use uniform 2-level quantization

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## step 2: comparison

Approach 1:  
quantize based on threshold  $T_i^s$  for pixel location  $i$

Approach 2:

- add  $\frac{1}{2} - T_i^s$  to pixel value for location  $i$
- quantize using  $\frac{1}{2}$  threshold

the two approaches yield identical results for any pixel value  $v$  and location  $i$  since

$$v < T_i^s \quad \text{iff} \quad v + \frac{1}{2} - T_i^s < \frac{1}{2}$$

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## step 2: comparison

this may be easier to implement in project 1 since the image class will perform step (b) automatically

Approach 2:

- add  $\frac{1}{2} - T_i^s$  to pixel value for location  $i$
- quantize using  $\frac{1}{2}$  threshold

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108

## ordered dither

- another view**
  - easier to implement in ip framework
- generalizations**
  - simulate more output levels
  - use more bits/pixel/channel

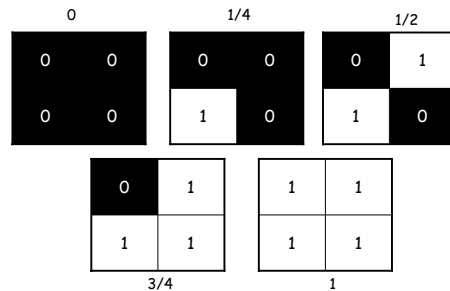
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with window size  $k \times k$  we can simulate  $k^2+1$  levels

$k=2, k^2+1=5$



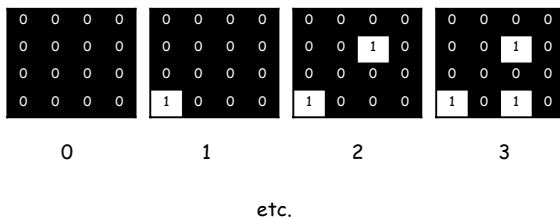
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110

with window size  $k \times k$  we can simulate  $k^2+1$  levels

$k=4, k^2+1=17$



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111

## Bayer's ordered 4x4: pixel locations

this can be derived recursively from 2x2

16	8	14	6
4	12	2	10
13	5	15	7
1	9	3	11

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112

### Bayer's ordered 4x4: pixel location

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16	8	14	6
4	12	2	10
13	5	15	7
1	9	3	11

### Bayer's ordered 2x2: pixel locations

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4	2
1	3

### Bayer's ordered 4x4: pixel location

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16	8	14	6
4	12	2	10
13	5	15	7
1	9	3	11

etc.

### other sizes

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- $k=2,4, \dots, 2^i$  use Bayer's
- for others make up your own but be careful of creating artifacts

### ordered dither

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- **another view**
  - easier to implement in ip framework
- **generalizations**
  - simulate more output levels
  - use more bits/pixel/channel

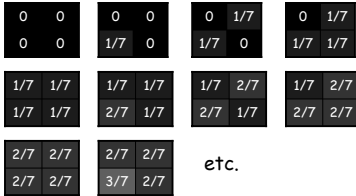
### Ordered Dither: $n$ bits, $k \times k$ neighborhood

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- we can use any one of  $N=2^n$  output levels for each pixel
- we can simulate a total of  $(N-1) \cdot k^2 + 1$  output levels

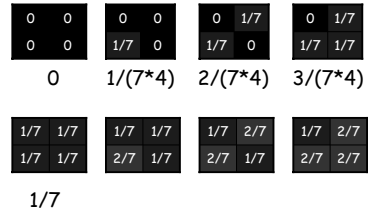
### Example n=3, k=2

- $2^n=8$  output levels:  
 $0=0/7, 1/7, 2/7, \dots, 6/7, 7/7=1$
- simulated levels

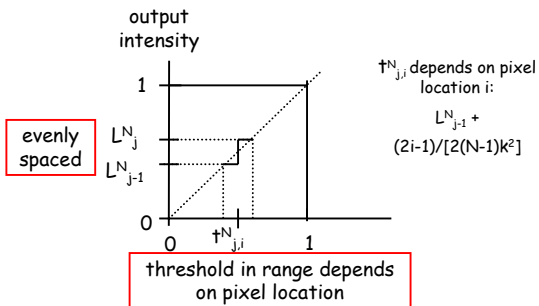


### Example n=3, k=2

simulated levels:  $n^2-1=7, k^2=4$



### Ordered Dither: n bits, $N=2^n$ output levels



### Alternate View Ordered Dither: n bits $N=2^n$ levels

