

Multimedia Coding and Transmission

Image Coding

Ifi, UiO

Norsk Regnesentral

Vårsemester 2005

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10110100



This part of the course ...

- ... is held at Ifi, UiO ...
(Wolfgang Leister)
- ... and at University College Karlsruhe
(Peter Oel, Clemens Knoerzer)



The story so far ...

- Data compression
 - information theory
 - run length encoding
 - Huffman coding
 - Zif-Lempel(-Welch) algorithm
 - Arithmetic coding



JPEG

- Joint Photographic Expert Group
- 1991 - 1993
- CCITT, ISO 10918
- Lossless coding (Comp. 2:1)
- Coding with loss (10:1-40:1)
- Parameter controls image quality
- Not limited for certain image types

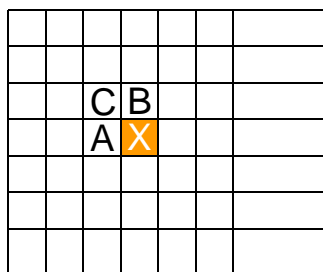


JPEG

- Discrete Cosine Transformation (DCT)
- Huffman- or Arithmetic Coding
- Modes:
 - Lossless Coding
 - Sequential Coding
 - Progressive Coding
 - Hierarchical Coding
- Not a file format !!! → JFIFF



Lossless Coding

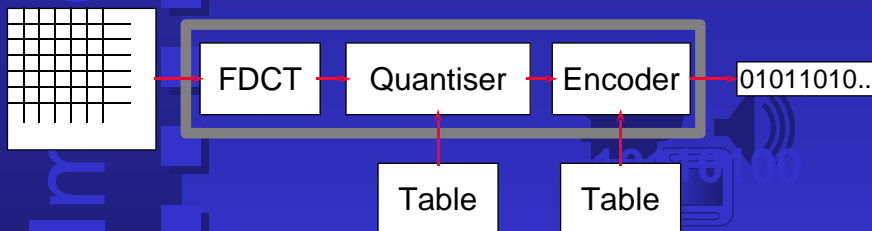


| Nr. | Prediction |
|-----|-------------|
| 0 | - |
| 1 | A |
| 2 | B |
| 3 | C |
| 4 | $A+B-C$ |
| 5 | $A+(B-C)/2$ |
| 6 | $B+(A-C)/2$ |
| 7 | $(A+B)/2$ |

(Vhs. Diff.)(Vhs. Diff.)(Vhs. Diff)...

Lossy Coding

- Subdivision in 8x8 Blocks
- Transformation in frequency space
- Quantising
- Coding (Huffman or arithmetic Coding)

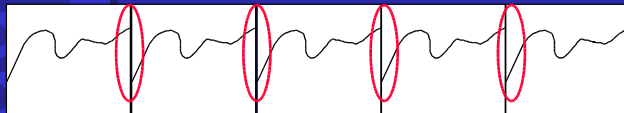


Why DCT?

- Why use frequency domain?
 - better statistic distribution
 - many low frequency parts
 - few high frequent parts
 - quantising better possible
 - Humans see high frequencies only for high contrast values

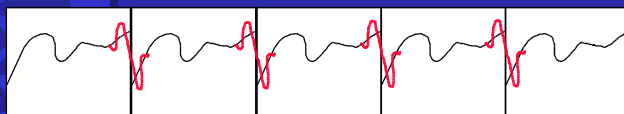
Why DCT?

- Why not Fourier Transform?
 - 8x8 Blocks
 - FT: ringing at block edges



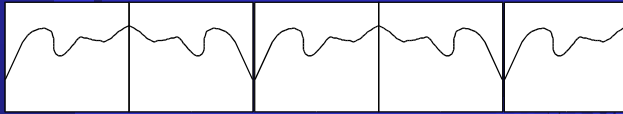
Why DCT?

- Why not Fourier Transform?
 - 8x8 Blocks
 - FT: ringing at block edges

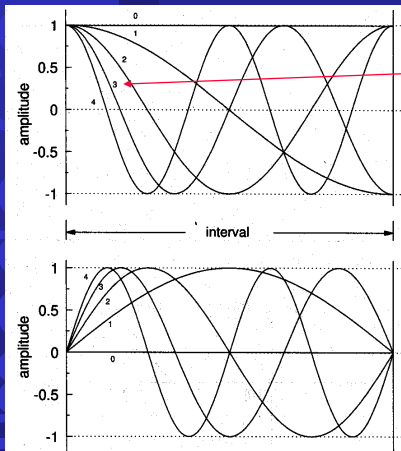


Why DCT?

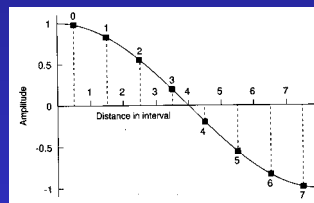
- Why not Fourier Transform?
 - 8x8 Blocks
 - FT: ringing at block edges
 - Mirroring produces even function
 - Sinus coefficients disappear



DCT

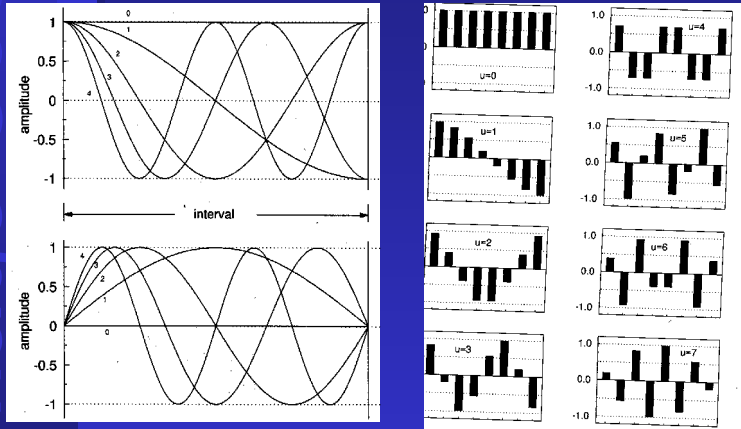


cosine, sine functions
 $f(t) = \cos(u \cdot t)$

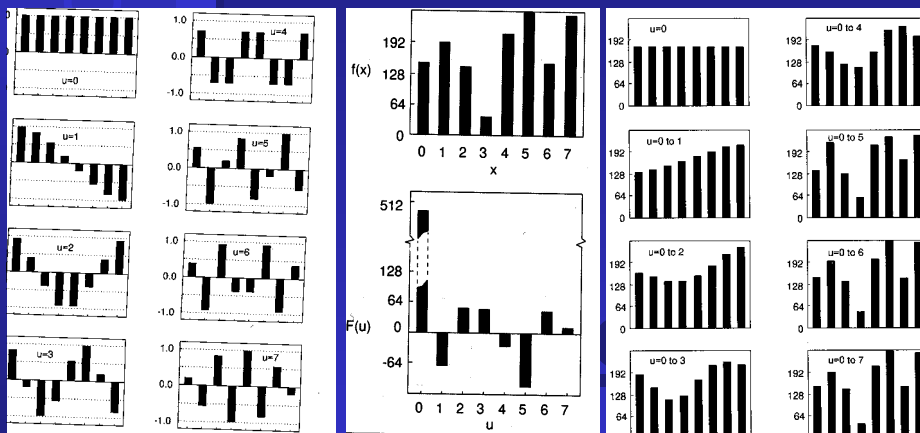


sampling of function

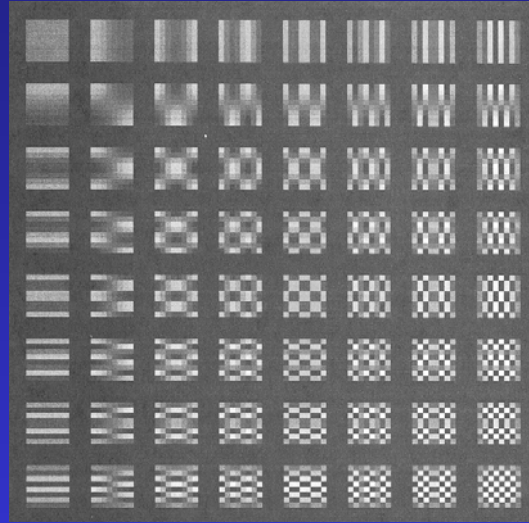
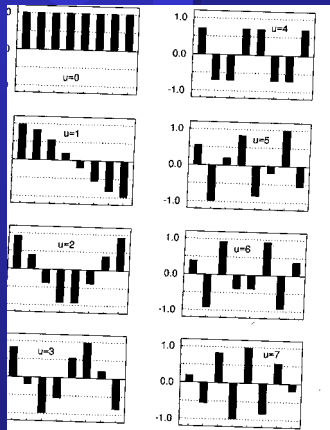
DCT - basis functions



DCT - example



DCT 1D - 2D




Inverse DCT (decoding)

pixels

coefficients

$$f(x, y) = \frac{1}{4} \left[\sum_{u=0}^7 \sum_{v=0}^7 C(u)C(v)F(u, v) * \cos \frac{(2x+1)u}{16} \cos \frac{(2y+1)v}{16} \right]$$

for $C(u), C(v) = \frac{1}{\sqrt{2}}$ when $u, v = 0$
 $C(u), C(v) = 1$ else



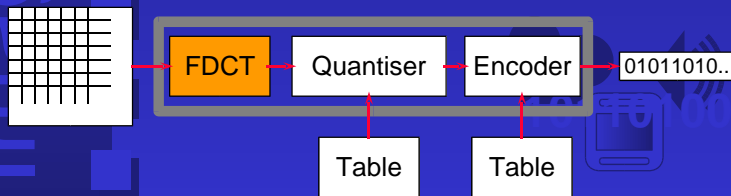
(Forward)DCT

- unsigned → signed

- FDCT:
$$F(u, v) = \frac{1}{4} C(u)C(v) \left[\sum_{x=0}^7 \sum_{y=0}^7 f(x, y) * \cos \frac{(2x+1)u}{16} \cos \frac{(2y+1)v}{16} \right]$$

with $C(u), C(v) = \frac{1}{\sqrt{2}}$ for $u, v = 0$

$C(u), C(v) = 1$ else



(Forward)DCT

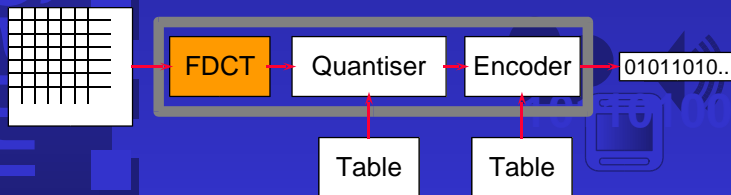
| | | | | | | | |
|-----|-----|-----|-----|-----|-----|-----|-----|
| 139 | 144 | 149 | 153 | 155 | 155 | 155 | 155 |
| 144 | 151 | 153 | 156 | 159 | 156 | 156 | 156 |
| 150 | 155 | 160 | 163 | 158 | 156 | 156 | 156 |
| 159 | 161 | 162 | 160 | 160 | 159 | 159 | 159 |
| 159 | 160 | 161 | 162 | 162 | 155 | 155 | 155 |
| 161 | 161 | 161 | 161 | 160 | 157 | 157 | 157 |
| 162 | 162 | 161 | 163 | 162 | 157 | 157 | 157 |
| 162 | 162 | 161 | 161 | 163 | 158 | 158 | 158 |

| | | | | | | | |
|----|----|----|----|----|----|----|----|
| 11 | 16 | 21 | 25 | 27 | 27 | 27 | 27 |
| 16 | 23 | 25 | 28 | 31 | 28 | 28 | 28 |
| 22 | 27 | 32 | 35 | 30 | 28 | 28 | 28 |
| 31 | 33 | 34 | 32 | 32 | 31 | 31 | 31 |
| 31 | 32 | 33 | 34 | 34 | 27 | 27 | 27 |
| 33 | 33 | 33 | 33 | 32 | 29 | 29 | 29 |
| 34 | 34 | 33 | 35 | 34 | 29 | 29 | 29 |
| 34 | 34 | 33 | 33 | 35 | 30 | 30 | 30 |

| | | | | | | | |
|-------|-------|-------|------|------|------|------|------|
| 235.6 | -1.0 | -12.1 | -5.2 | 2.1 | -1.7 | -2.7 | 1.3 |
| -22.6 | -17.5 | -6.2 | -3.2 | -2.9 | -0.1 | 0.4 | -1.2 |
| -10.9 | -9.3 | -1.6 | 1.5 | 0.2 | -0.9 | -0.6 | -0.1 |
| -7.1 | -1.9 | 0.2 | 1.5 | 0.9 | -0.1 | 0.0 | 0.3 |
| -0.6 | -0.8 | 1.5 | 1.6 | -0.1 | -0.7 | 0.6 | 1.3 |
| 1.8 | -0.2 | 1.6 | -0.3 | -0.8 | 1.5 | 1.0 | -1.0 |
| -1.3 | -0.4 | -0.3 | -1.5 | -0.5 | 1.7 | 1.1 | -0.8 |
| -2.6 | 1.6 | -3.8 | -1.8 | 1.9 | 1.2 | -0.6 | -0.4 |

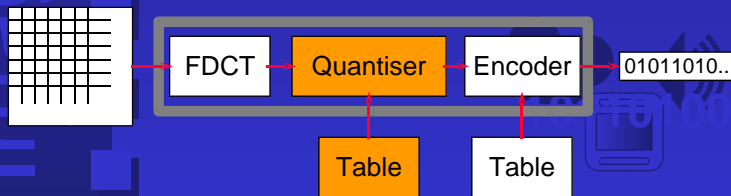
unsigned → signed

→
FDCT



Quantising

$$F^Q(u, v) = \text{Integer} \left(\frac{F(u, v)}{Q(u, v)} \right)$$



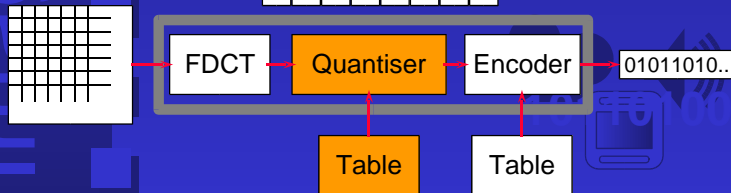
Quantising

| | | | | | | | |
|-------|-------|-------|------|------|------|------|------|
| 235.6 | -1.0 | -12.1 | -5.2 | 2.1 | -1.7 | -2.7 | 1.3 |
| -22.6 | -17.5 | -6.2 | -3.2 | -2.9 | -0.1 | 0.4 | -1.2 |
| -10.9 | -9.3 | -1.6 | 1.5 | 0.2 | -0.9 | -0.6 | -0.1 |
| -7.1 | -1.9 | 0.2 | 1.5 | 0.9 | -0.1 | 0.0 | 0.3 |
| -0.6 | -0.8 | 1.5 | 1.6 | -0.1 | -0.7 | 0.6 | 1.3 |
| 1.8 | -0.2 | 1.6 | -0.3 | -0.8 | 1.5 | 1.0 | -1.0 |
| -1.3 | -0.4 | -0.3 | -1.5 | -0.5 | 1.7 | 1.1 | -0.8 |
| -2.6 | 1.6 | -3.8 | -1.8 | 1.9 | 1.2 | -0.6 | -0.4 |

| | | | | | | | |
|----|----|----|----|-----|-----|-----|-----|
| 16 | 11 | 10 | 16 | 24 | 40 | 51 | 61 |
| 12 | 12 | 14 | 19 | 26 | 58 | 60 | 55 |
| 14 | 13 | 16 | 24 | 40 | 57 | 69 | 56 |
| 14 | 17 | 22 | 29 | 51 | 87 | 80 | 62 |
| 18 | 22 | 37 | 56 | 68 | 109 | 103 | 77 |
| 24 | 35 | 55 | 64 | 81 | 104 | 113 | 92 |
| 49 | 64 | 78 | 87 | 103 | 121 | 120 | 101 |
| 72 | 92 | 95 | 98 | 112 | 100 | 103 | 99 |

Quantiser Table

| | | | | | | | |
|----|----|----|---|---|---|---|---|
| 15 | 0 | -1 | 0 | 0 | 0 | 0 | 0 |
| -2 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| -1 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |



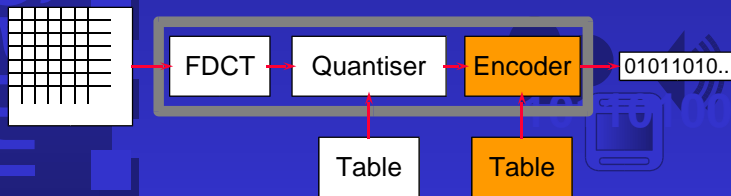
Coding

- 1 DC-Coefficient
- 63 AC-Coefficients

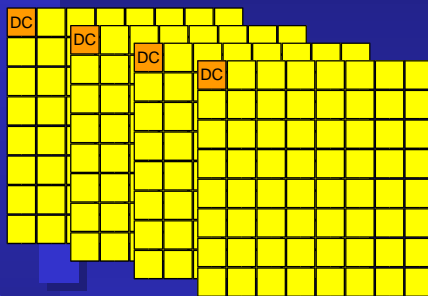
DC

| | | | | | | | |
|----|----|----|---|---|---|---|---|
| 15 | 0 | -1 | 0 | 0 | 0 | 0 | 0 |
| -2 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| -1 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

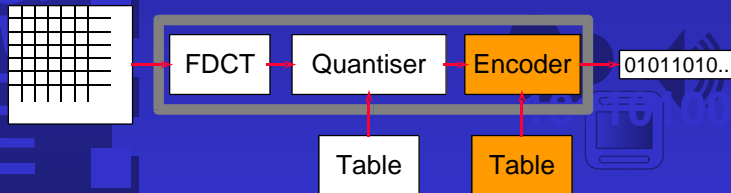
AC



DC-Coding



$$\Delta DC_i = DC_i - DC_{i-1}$$



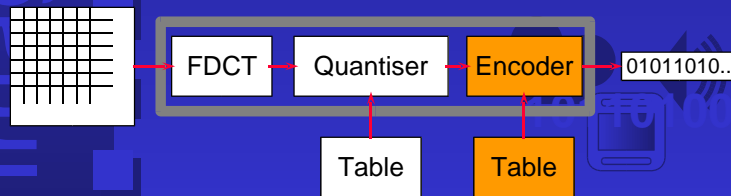
DC-Coding

$$\Delta DC_i = DC_i - DC_{i-1}$$

$$\Delta DC_i = (\text{Length}, \text{Value})$$

Length=Huffman-Coded

Value=(Sign, abs Value)

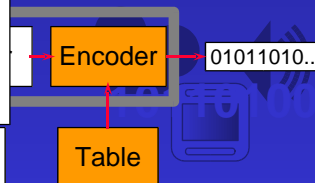


DC-Coding

| Length | Value |
|--------|------------------------|
| 0 | 0 |
| 1 | -1, 1 |
| 2 | -3,-2, 2,3 |
| 3 | -7,-4, 4,7 |
| 4 | -15,-8, 8,15 |
| 5 | -31,-16, 16,31 |
| 6 | -63,-32, 32,63 |
| 7 | -127,-64, 64,127 |
| 8 | -255,-128, 128,255 |
| 9 | -511,-256, 256,511 |
| 10 | -1023,-512, 512,1023 |
| 11 | -2047,-1024, 1024,2047 |

Examples:

-3 : (2).1.1
 -1 : (1).1.
 0 : (0)..
 5 : (3).0.01
 67 : (7).0.000011

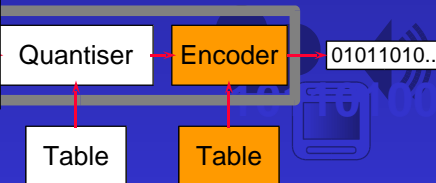


DC-Coding

| Length | Code |
|--------|-----------|
| 0 | 00 |
| 1 | 010 |
| 2 | 011 |
| 3 | 100 |
| 4 | 101 |
| 5 | 110 |
| 6 | 1110 |
| 7 | 11110 |
| 8 | 111110 |
| 9 | 1111110 |
| 10 | 11111110 |
| 11 | 111111110 |

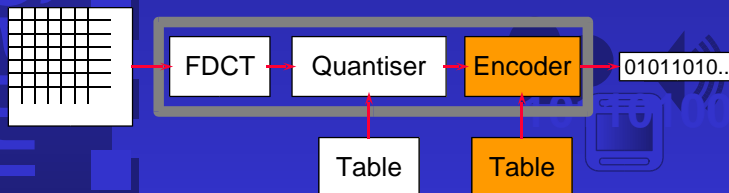
Examples:

-3 : (2).1.1 : 011.1.1
-1 : (1).1. : 010.1.
0 : (0).. : 00..
5 : (3).0.01 : 100.0.01
67 : (7).0.000011: 11110.0.000011

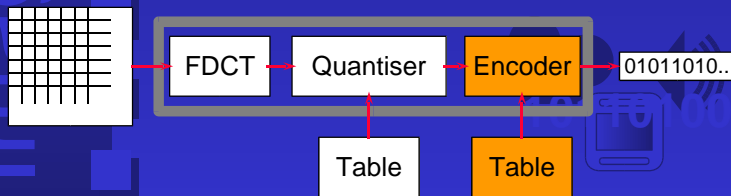
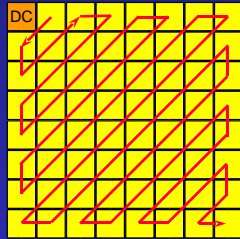


AC-Coding

- Zig-Zag Serialising
- Zero run length
- Huffman-Coding



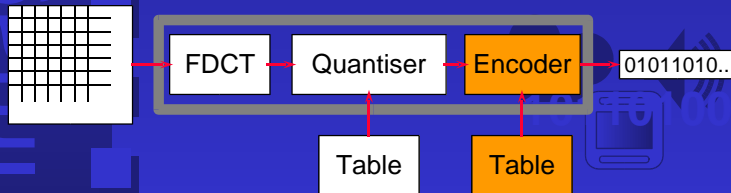
Zig-Zag Serialising



AC-Coding

- 0,-2,-1,-1,-1,0,0,-1,0,0,0,0,...
- (1x0),-2,(0x0),-1,(0x0),-1,(0x0),-1,(2x0),-1,<EOB>
- (1),-2,(0),-1,(0),-1,(0),-1,(2),-1,<EOB>

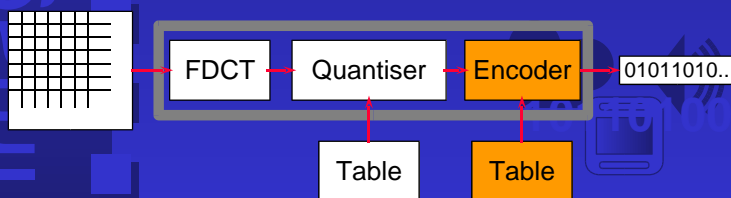
| | | | | | | | |
|----|----|----|---|---|---|---|---|
| 15 | 0 | -1 | 0 | 0 | 0 | 0 | 0 |
| -2 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| -1 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |



AC-Coding

- 0,-2,-1,-1,-1,0,0,-1,0,0,0,0,...
- (1x0),-2,(0x0),-1,(0x0),-1,(0x0),-1,(2x0),-1,<EOB>
- (1),-2,(0),-1,(0),-1,(0),-1,(2),-1,<EOB>
- (1),((2).1.0),(0),((1).1),(0),((1).1),(0),((1).1),(2),((1).1),<EOB>

| | | | | | | | |
|----|----|----|---|---|---|---|---|
| 15 | 0 | -1 | 0 | 0 | 0 | 0 | 0 |
| -2 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| -1 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |



AC-Coding

- 0,-2,-1,-1,-1,0,0,-1,0,0,0,0,...
- (1x0),-2,(0x0),-1,(0x0),-1,(0x0),-1,(2x0),-1,<EOB>
- (1),-2,(0),-1,(0),-1,(0),-1,(2),-1,<EOB>
- (1),((2).1.0),(0),((1).1),(0),((1).1),(0),((1).1),(2),((1).1),<EOB>
- (1/2).1.0,(0/1).1,(0/1).1,(0/1).1,(2/1).1,<EOB>

| | | | | | | | |
|----|----|----|---|---|---|---|---|
| 15 | 0 | -1 | 0 | 0 | 0 | 0 | 0 |
| -2 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| -1 | -1 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

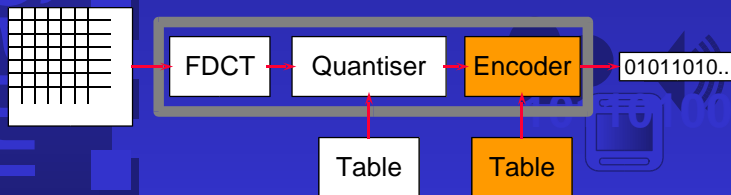



Image Coding

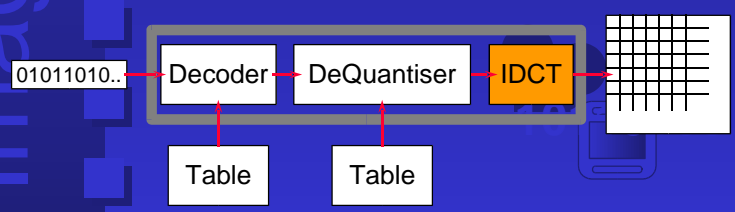
- 0,-2,-1,-1,-1,0
- (1x0),-2,(0x0)
- (2x0),-1,<EOB>
- (1),-2,(0),-1,(0)
- (1),((2).1.0),(0)
- ((1).1),(2),((1).1),...
- (1/2).1.0,(0/1).1,(0/1).1,(0/1).1,(2/1).1,<EOB>
- 11011 1 0 00 1 00 1 00 1 11100 1 1010
- 63 AC-Coefficients → 26 Bit

| | | | |
|-------|----------|--------|-------------|
| <EOB> | 1010 | 1/1 | 1100 |
| 0/1 | 00 | 1/2 | 11011 |
| 0/2 | 01 | | |
| 0/3 | 100 | 2/1 | 11100 |
| 0/4 | 1011 | 2/2 | 11111001 |
| 0/5 | 11010 | | |
| 0/6 | 1111000 | 15/1 | ... |
| 0/7 | 11111000 | ... | |
| ... | | 15/10 | ... |
| 0/10 | | <ZR16> | 11111111001 |



Decompression

- DeCoding
- Rescale by DeQuantising
- Inverse DCT



```

graph LR
    Input[01011010...] --> Decoder
    Decoder --> DeQuantiser
    DeQuantiser --> IDCT
    IDCT --> Output[Grid]
    Table1[Table] --- Decoder
    Table2[Table] --- DeQuantiser
  
```


Inverse DCT

- IDCT:

$$f(x, y) = \frac{1}{4} \left[\sum_{u=0}^7 \sum_{v=0}^7 C(u)C(v)F(u, v) * \cos \frac{(2x+1)u}{16} \cos \frac{(2y+1)v}{16} \right]$$

for $C(u), C(v) = \frac{1}{\sqrt{2}}$ when $u, v = 0$

$C(u), C(v) = 1$ else



Compression Results

| n:1 | Quality |
|---------|-----------------------------------|
| 30 - 20 | usable - good |
| 20 - 10 | good - very good |
| 10 - 5 | excellent |
| 5 - 4 | not distinguishable from original |

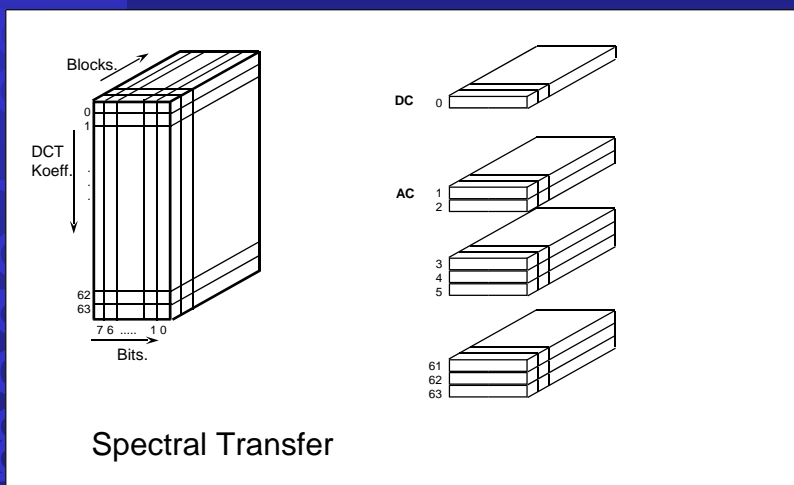


Progressive Mode

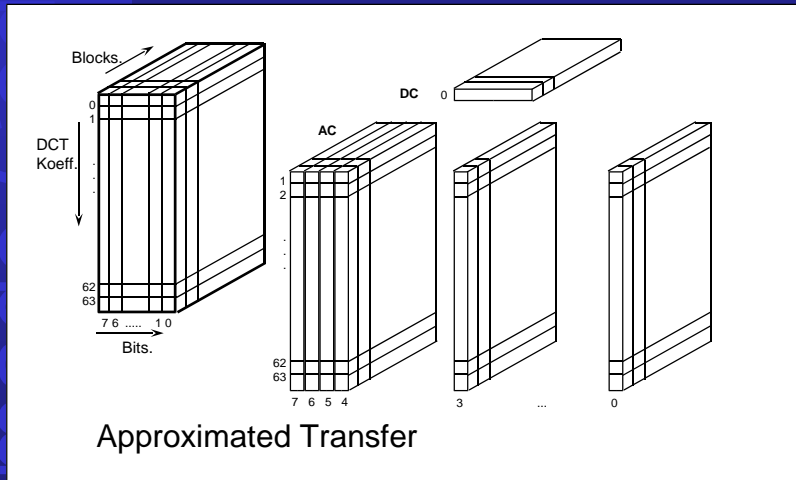
- Transfer coefficients partially in several runs.
- Two Possibilities:
 - Spectral Transfer
 - Approximated Transfer



Progressive Mode



Progressiver Modus



Hierarchical Mode

- Code image with low resolution first
- Code higher resolution as difference to previous lower resolution
- Image is represented in several resolutions
- Unnecessry data are not transferred



Images with several channels

- JPEG can use several (Colour)-Channels (e.g., $Y C_b C_r$)
- Channels can have different resolution
- Resolution factor as whole number
- JPEG method does not bother about channels



JFIF

- JPEG defines algorithm only.
- JPEG is not a file format
- JPEG is colour-blind
- Parameters and tables are pre-defined
- Based on JPEG mode of TIFF 6.0
- Consists of segments which are defined by markers (like TIFF)

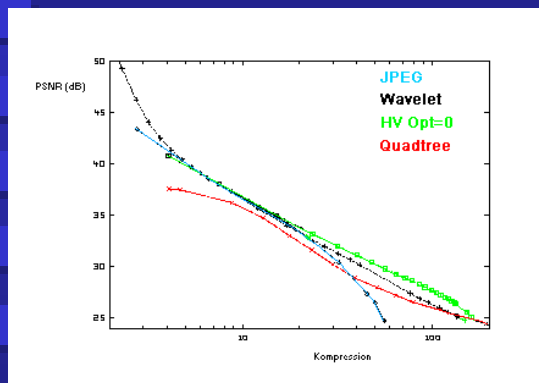


Is JPEG good enough?

- Visible blocks for high compression rates
- For compression rates > 40:1 JPEG does not work well.
- low frequencies are not taken into account.
- **Wavelet Coding**
 - Good quality up to 60:1
 - Linear degradation for higher compression rates
 - No visible blocks
 - JPEG 2000 Standard
- **Fractal Coding**



Comparison



Literature

- JPEG:
 - Pennebaker, Mitchell: **JPEG, Still Image Data Compression Standard**, Van Nostrand Reinhold (1993)
- Wavelet-Coding:
 - Daubechies: **Ten Lectures on Wavelets**, Society for Industrial and Applied Mathematics



Literature

- Fournier: **Wavelets an their Applications in Computer Graphics**, SIGGRAPH `94 Course Notes
- Fractal Coding:
 - Barnsley, Hurd: **Fractal Image Compression**, AK Peters Ltd (1993)
 - Fisher: **Fractal Image Compression**, SIGGRAPH `92 Course Notes



The End of this Lecture

