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Multimedia Technology

Section # 5: Principles of Coding

Instructor: George Xylomenos

Department: Informatics

Contents

- Coding requirements
- Types of coding
- Entropy coding
- Differential / predictive coding
- Transform coding
- Layered coding
- Vector quantization

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Coding requirements

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Basic requirements (1 of 4)

- Uncompressed data volume for media
 - Voice (telephony): 64 Kbps (8 KHz, 8 bits)
 - Audio (CD): 705,6x2 Kbps (44,1 KHz, 16 bits)
 - Video (CCIR-601): 216 Mbps (13,5 MHz, 4:2:2, 8 bits)
 - Without blanking intervals: 166 Mbps
- Compression and decompression
 - Storage to disks
 - Transmission via network
 - Caching in memory

Basic requirements (2 of 4)

- Desirable features
 - High fidelity
 - Lowering fidelity allows more compression
 - Low complexity
 - Impacts cost of implementation
 - What is “low” changes over time
 - Low latency (delay)
 - Important in real-time communication

Basic requirements (3 of 4)

- Requirements of synchronous applications
 - Compression/decompression latency < 50 ms
 - End-to-end latency < 150 ms for telephony
 - Much (much!) lower for music performance
- Requirements of interactive applications
 - Quick repositioning (forward / backward)
 - Random access in <500 ms
 - Decompression with no additional data

Basic requirements (4 of 4)

- General requirements
 - Flexible formats
 - Different bitrates
 - Ideally, variable bitrates
 - Synchronization points between media
 - Software or hardware decoding
 - Depending on the application
 - Standardized techniques
 - Allowing mass production

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Types of coding

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Categorization

- Lossless
 - Information can be fully recovered (FLAC)
- Lossy
 - Controlled loss of information (MP3)
- Symmetric
 - Same cost for compression / decompression
- Asymmetric
 - Almost always, decompression is simpler

Types of coding (1 of 2)

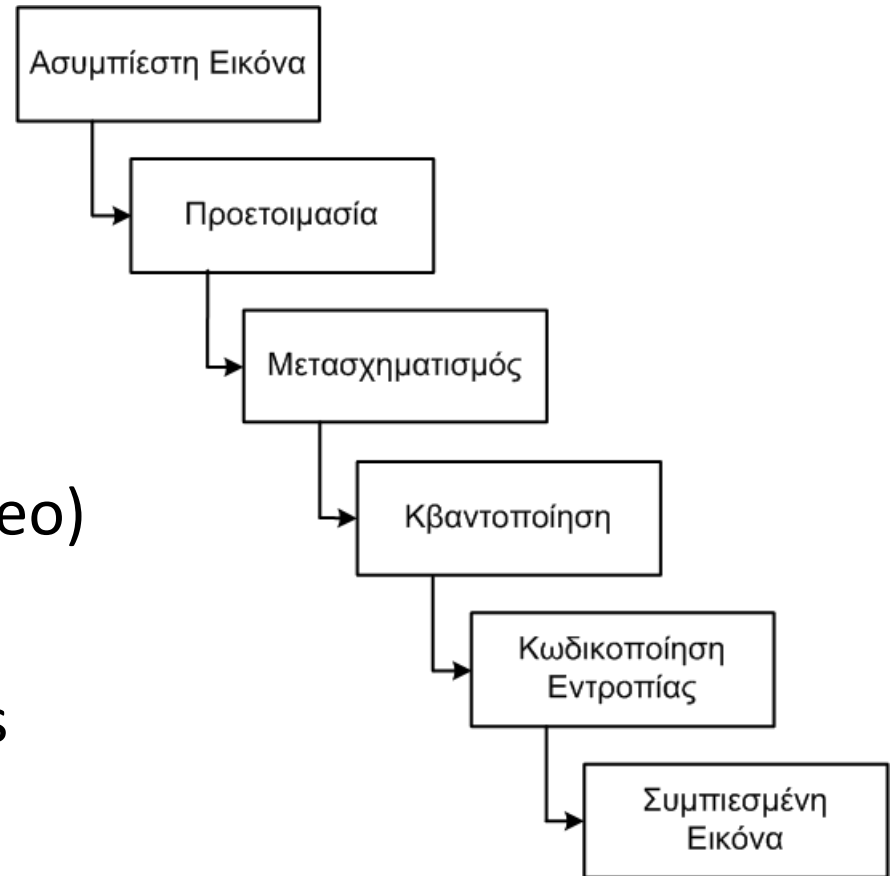
- Entropy coding
 - Disregards media content
 - Lossless
- Source coding
 - Understands media content
 - Lossy or lossless
- Hybrid coding
 - Usually, first source and then entropy coding

Types of coding (2 of 2)

Category	Example
Entropy	Run Length Huffman Arithmetic LZx
Source	Differential/predictive Transform Layered Vector quantization
Hybrid	JPEG MPEG-x H.26x

Coding flow (JPEG)

- Preparation
 - RGB to YUV
- Processing
 - DCT/FFT (transform)
 - Motion prediction (in video)
- Quantization
- To (fewer) discrete values
- Entropy coding
 - Lossless compression of resulting flow



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Entropy coding

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Removing redundancy (1 of 3)

- Run length encoding (RLE)
 - Replaces sequences of the same symbol
 - Flag “~”, run length – 4, Byte
 - Does not make sense for smaller runs
 - Byte stuffing if the flag is in the data (~~)
 - Good (mostly) for drawings
 - Long runs of pixels with the same color
 - Very rare in photographs

Removing redundancy (2 of 3)

- Example
 - Input: BBACCCCCC~A
 - Output: BBBA~2C~~A
- May even grow the file!
 - Few long runs, many appearances of ~
- Also possible with symbol groups
 - As long as there is periodicity
 - Example: RGB values (triples)

Removing redundancy (3 of 3)

- Coding of frequent words
 - Replaced by flag and word index
 - Needs a dictionary of common words
 - Good for programming language
 - Part of the input is unpredictable
 - But we have language keywords
 - May also exploit symbol table
 - E.g., variables and methods

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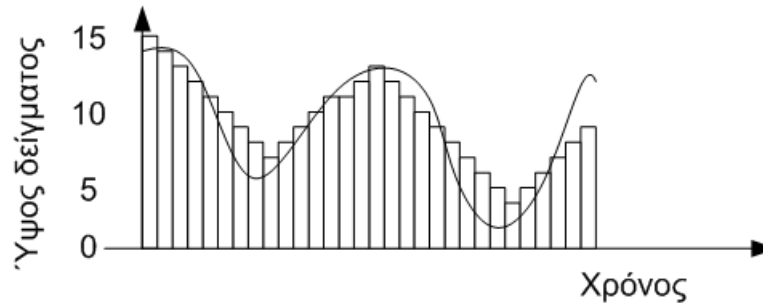
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Differential / predictive coding

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Differential coding (1 of 4)



- Encodes difference between values
 - Appropriate when values change slowly
 - Example: audio samples
 - Small differences between values...
 - ...large differences from zero

Differential coding (2 of 4)

- Delta coding
 - One bit per value (+1 or -1)
- Non-adaptive differential coding
 - Assume that we are limited to 4 bits per value
 - How can we best use them?
 - Encode small differences: [-8,+7] in single steps
 - Encode large differences: [-128,+127] in 16 steps
 - Either way, there may be some loss

Differential coding (3 of 4)

- Why is it also called predictive?
 - Every value is a predictor for the next one
 - We encode the change from the prediction
- Generalized in various ways
 - Adaptive to large/small changes
 - Use multiple values as predictor
- Coding requires memory
 - One or more past values for prediction
 - Same for decoding

Differential coding (4 of 4)

- Synchronization of predictors
 - Encoding may lose some information
 - The available bits may not be enough
 - The encoded value is distorted
 - The decoder only sees the encoded values
 - Its prediction is based on the distorted value
 - The encoder must also decode the values!
 - To make predictions based on the distorted ones

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Transform coding

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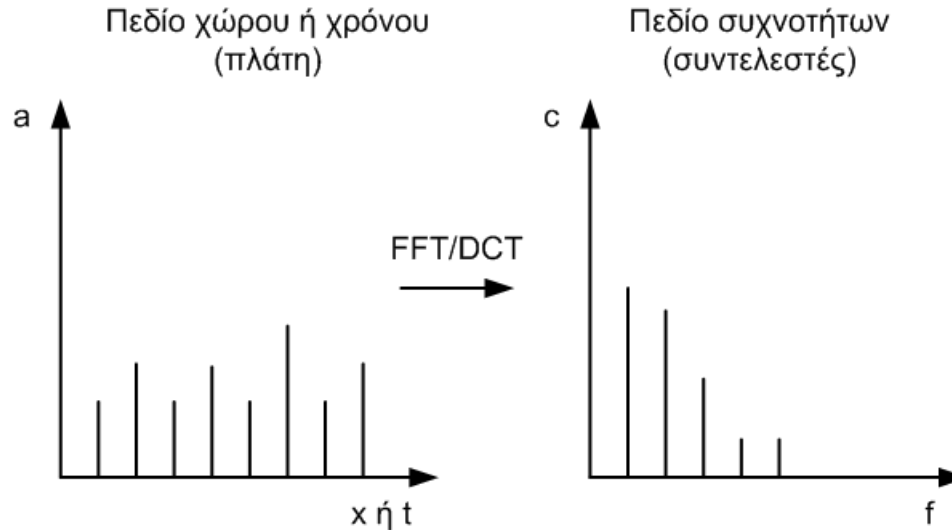
Why transforms?

- Transform an input field to an output field
 - Reversed transform for decoding
 - Example: FFT, DCT (intensities to frequencies)
 - The transform does NOT compress data
 - But the new field is better for compression
 - Separates more from less important values
 - More loss for less important values
 - Less loss for more important values

Fast Fourier Transform

- Fast Fourier Transform (FFT)
 - Input: signal at each time point $f(t)$
 - Output: coefficient of each frequency $g(l)$
 - Breaks down $f(t)$ to harmonics weighed by $g(l)$
 - Isolates most important coefficients
 - They are all at one end of the spectrum
 - Allows compression based on importance
 - Less loss for more important coefficients

Discrete Cosine Transform



- Discrete Cosine Transform (DCT)
 - Input: intensity at each point $f(x,y)$
 - Output: frequency coefficients $g(s,y)$
 - Two-dimensional transform
 - Used in JPEG and video

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Layered coding

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Layers (1 of 2)

- Layered coding
 - Splits information in multiple layers
 - Each layer is treated differently
- Sub-band coding
 - Splits signal to frequency sub-bands
 - Each sub-band is encoded separately
 - Approximates signal with a few sub-bands

Layers (2 of 2)

- Sub-sampling
 - Different sample rate for each component
 - More important components -> more samples
 - Approximates signal with basic components
- Heterogeneity
 - Each layer sent independently
 - Better approximation with more layers
 - Receiver chooses which layers to receive

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Vector quantization

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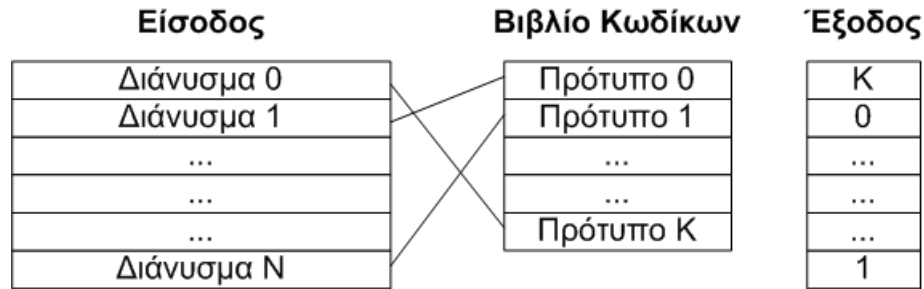
Code book (1 of 2)

- Code book contains vectors
 - Vectors: representative bit sequences
 - Encoding matches inputs to vector indexes
 - “Quantizes” input to closest matching vectors
- A good code book needs
 - Few code words
 - So that indexes are small
 - Code words that match inputs well
 - Small quantization losses

Code book (2 of 2)

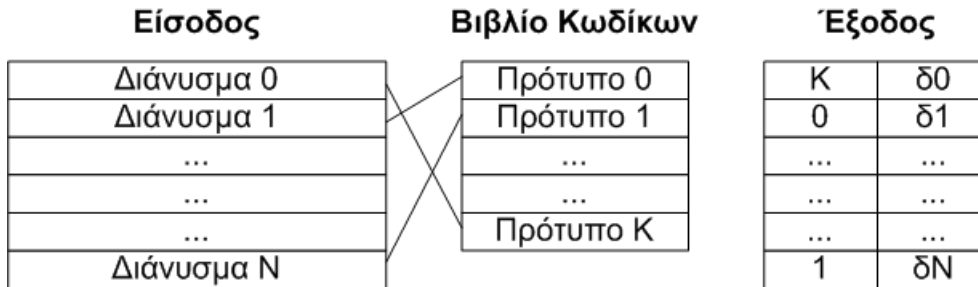
- Adaptive code books
 - We start with a basic set of code words
 - We add new code words as we proceed
 - Allows adaptation to source contents

Lossy VQ



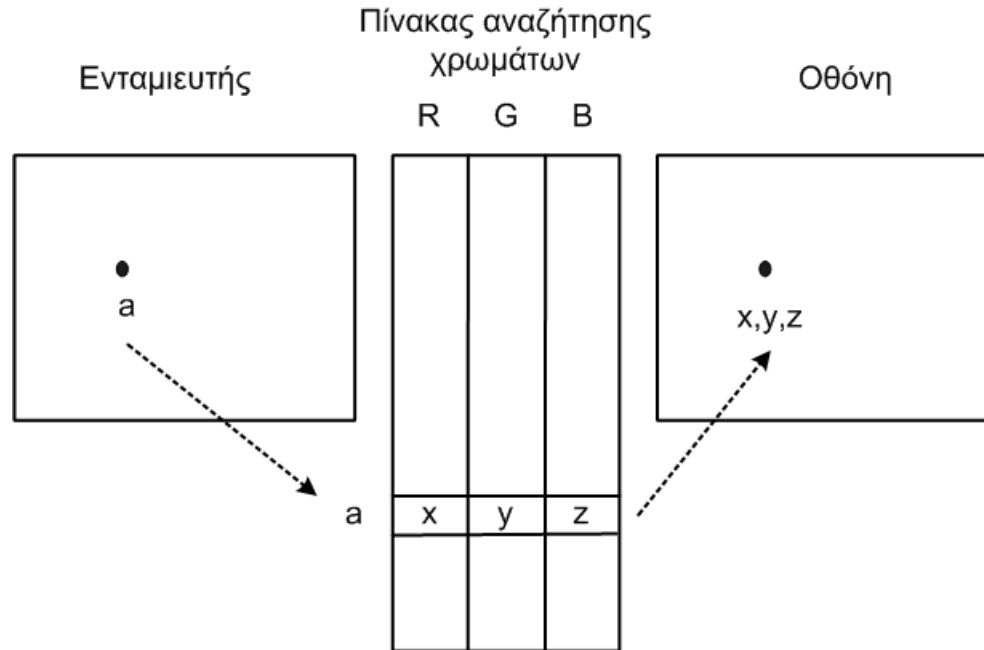
- Lossy variant
 - Code book with n byte code words
 - Input is broken into n byte vectors
 - Quantization to closest matching code word
 - The code book cannot contain all vectors
 - This leads to approximations (lossy)

Less lossy VQ



- Lossless variants
 - Same as lossy until the matching
 - Also sends difference from match
 - Requires more bits
 - Can reconstruct exact input
 - More often, just a less lossy version of it!

Example: CLUT



- Color Lookup Table (CLUT)
 - Each pixel encoded with an index
 - The index selects a color from a table
 - The table is the code book

How to choose colors? (1 of 3)

- Color space quantization
 - Example: from 24 bit to 8 bit color
 - Input: three 8 bit values (RGB)
 - Output: one of 256 colors (24 bits each)
 - Assume a resolution of 1920 x 1080
 - We start with 1920 x 1080 x 24 bit
 - We end with 1920 x 1080 x 8 bit
 - Plus a CLUT with 256 x 24 bit

How to choose colors? (2 of 3)

- Constructing a fixed CLUT
 - We can visualize colors as a 3D cube
 - Break the cube into equal rectangular blocks
 - Divide R and G by 32 (2^5) and B by 64 (2^6)
 - We basically create 8 x 8 x 4 blocks
 - Each block has a 3+3+2=8 bit index
 - Each rectangle is represented by its central color
 - Image content is disregarded
 - Color gradients are abrupt

How to choose colors? (3 of 3)

- Constructing an image-dependent CLUT
 - Sort pixels by R value and find their median m
 - Pixels with $R < m$ are assigned 0, $R \geq m$ are assigned 1
 - In each R block, do the same (split) for G values
 - In each RG block, do the same for B values
 - Repeat for R, G, B, R and G
 - Every pixel matched by an 8 bit index
 - Represented by the central color of its block
 - But the blocks are NOT equal!

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End of Section #5

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