

# **Error Control Coding - From Theory to Near-Capacity Implementation**

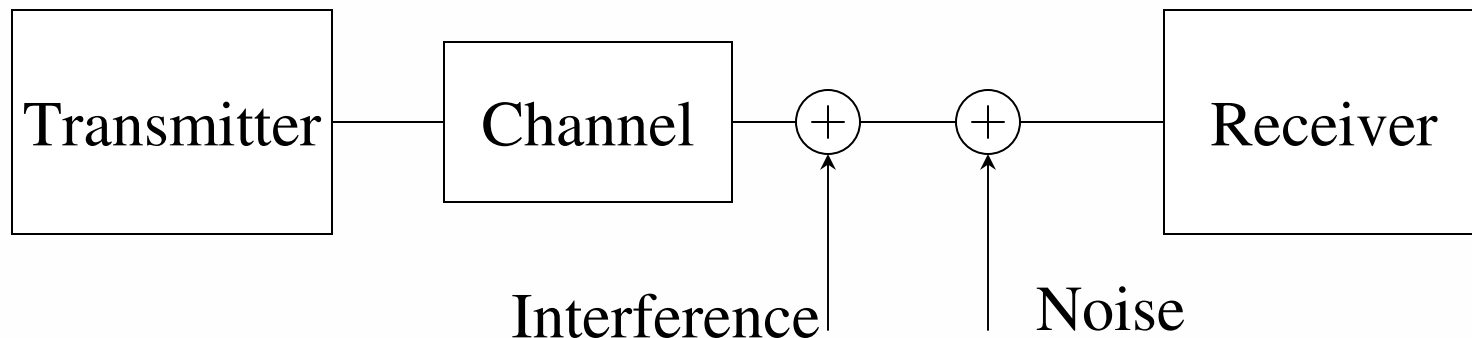
Pål Orten  
Nera Research



# Outline

- Why error control?
- What is possible with error control coding?
- Traditional Coding Schemes
- New Capacity Approaching Schemes
- Coding for High Spectral Efficiency
- Applications - including Nera Products
- Implementation Aspects

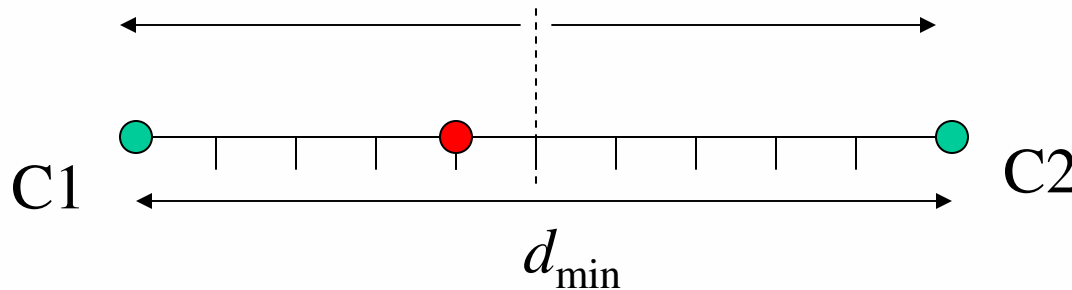
# Why Error Control Coding



- Thermal noise
- Channel: Fading and inter-symbol interference
- Interference:
  - from system itself and other systems
  - May be combated by channel coding (there are other ways also)

# Principle of error control

- Add redundancy to enable
  - Error detection
  - Error correction
  - or both
- $d_{\min} = 10$ , correct 4 errors, detect  $d_{\min} - 1$  errors



# *Some Theory*

# Shannon Limit

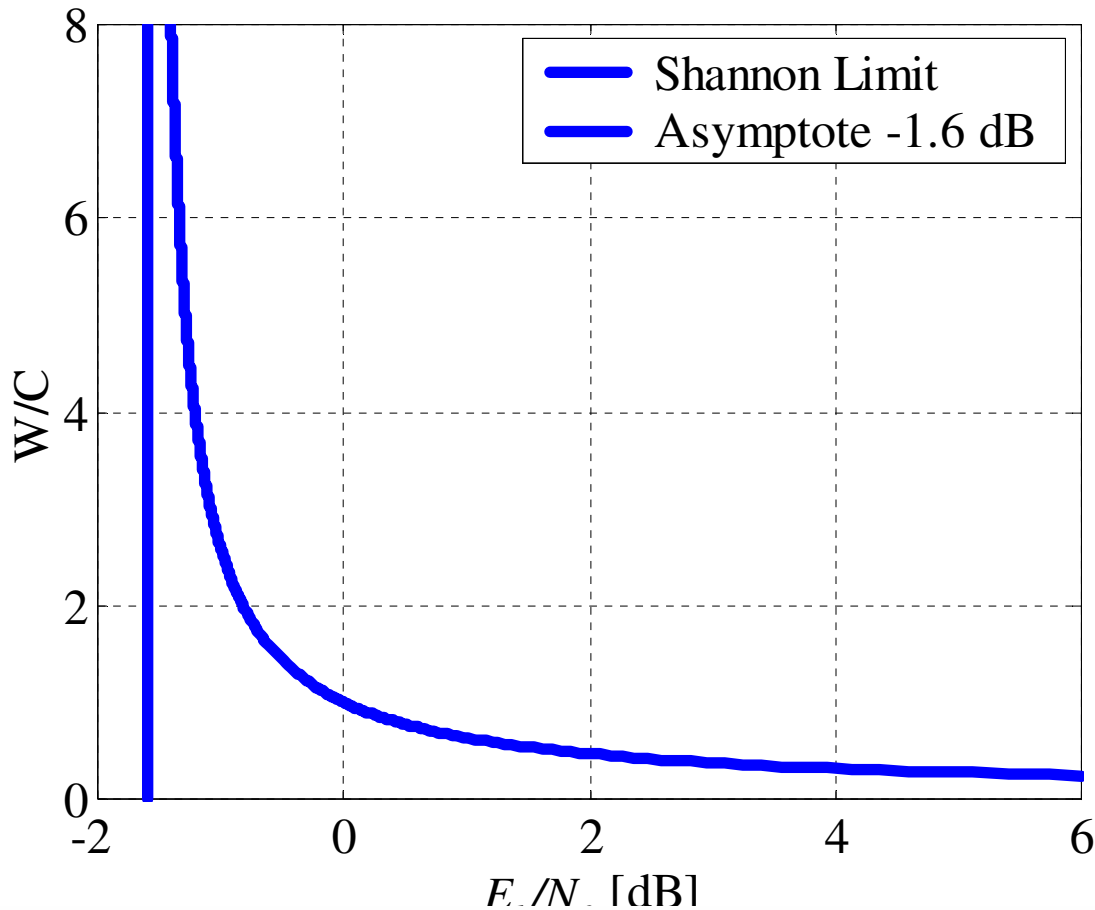
$$C = W \log_2 \left( 1 + \frac{S}{N} \right)$$

$$\Leftrightarrow \frac{E_b}{N_0} = \frac{W}{C} (2^{C/W} - 1)$$

$$W \rightarrow \infty \Rightarrow E_b / N_0 \rightarrow -1.6 \text{ dB}$$

No limit on input, AWGN channel

# $W/C$ versus $E_b/N_0$



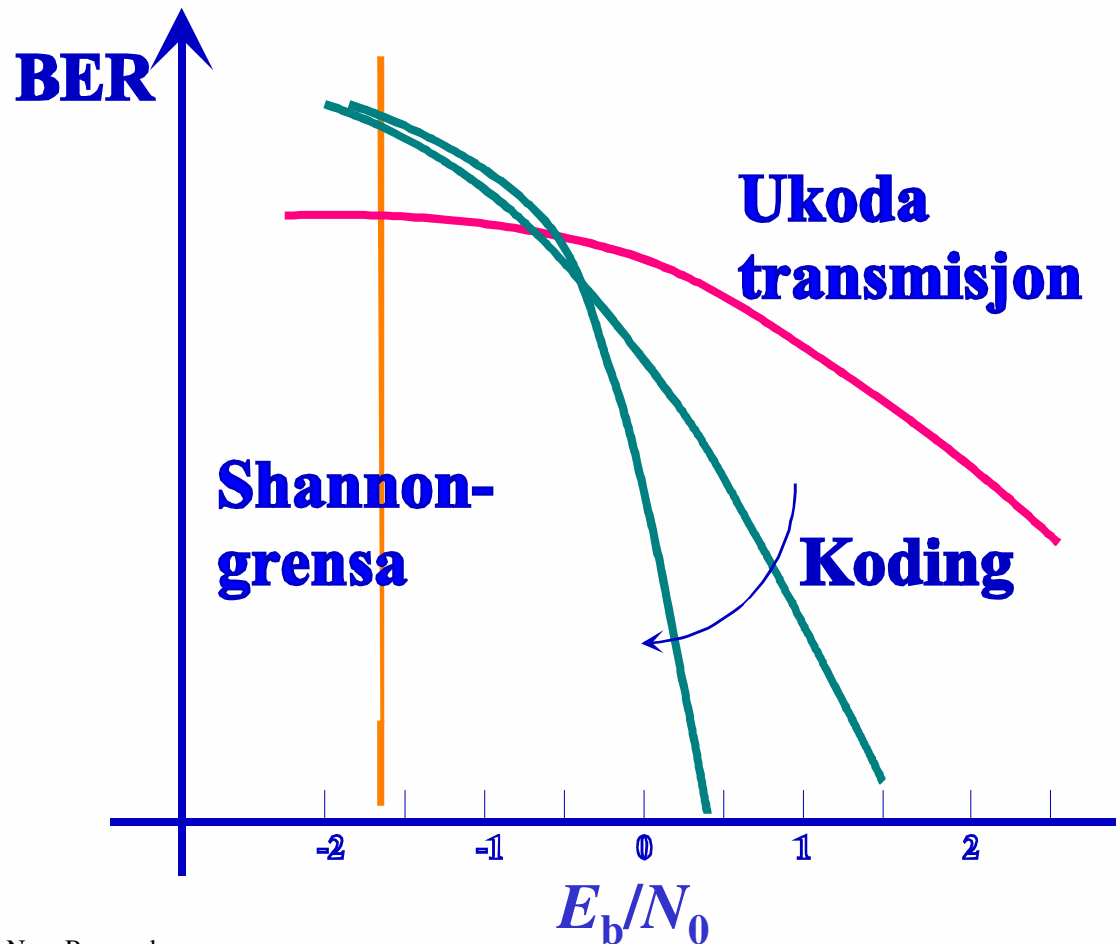
- No limit on input
- AWGN channel
- To reach the limit:
  - infinite bandwidth
  - infinite code word length

# For a Practical Application

- For a practical implementation:
  - code rate  $R_c > 0$
  - limits on input (given by modulation)
  - finite code word length

⇒ -1.6 dB limit - will not be achieved
- Practical Limit - for
  - code rate or bit/s/Hz
  - modulation type
  - code word length

# Effect of Coding



# Capacity for given Code Rate

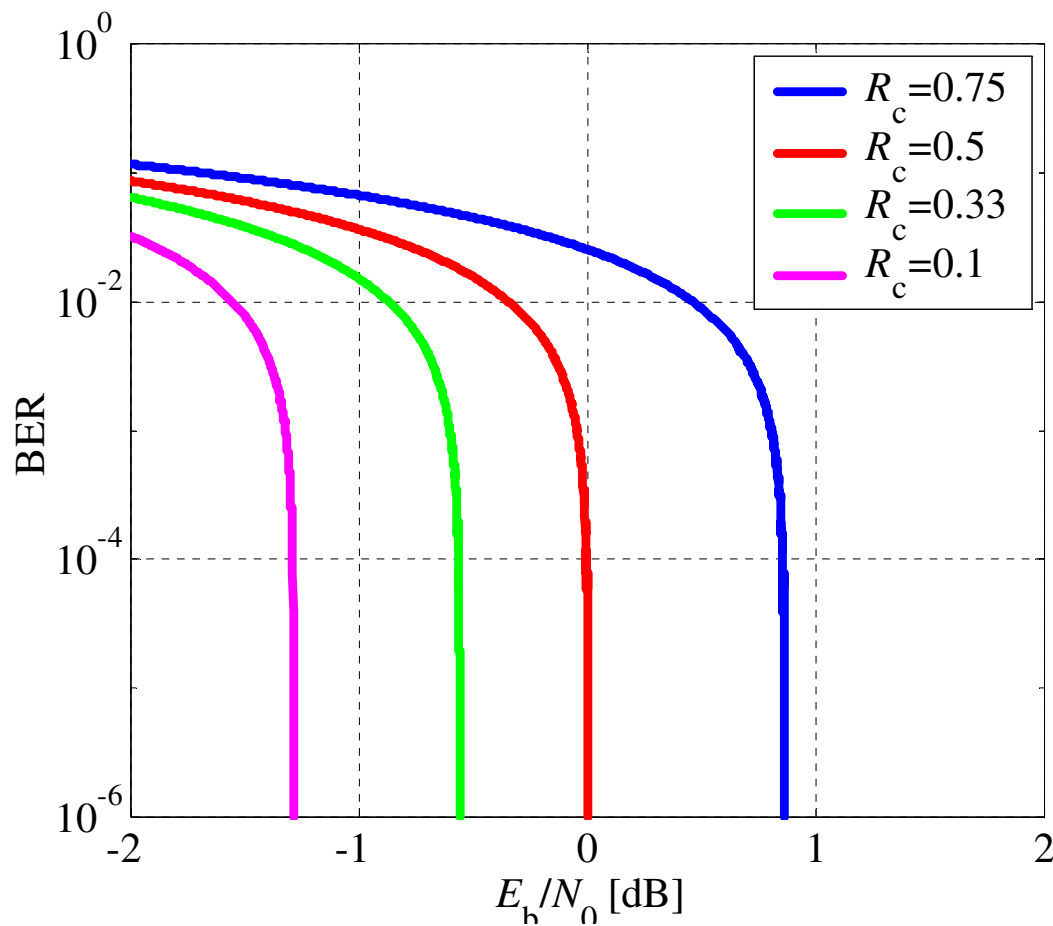
$$C = \frac{1}{2} \log_2 \left( 1 + \frac{2R_c E_b}{N_0} \right)$$

$$R_c \leq \frac{C}{1 - H_b(e)}$$

From the converse  
to the coding theorem

Find  $(P_b, E_b/N_0)$  pair  $\Rightarrow$  Limit for given code rate

# Capacity for different code rates



Unconstrained  
AWGN  
Channel

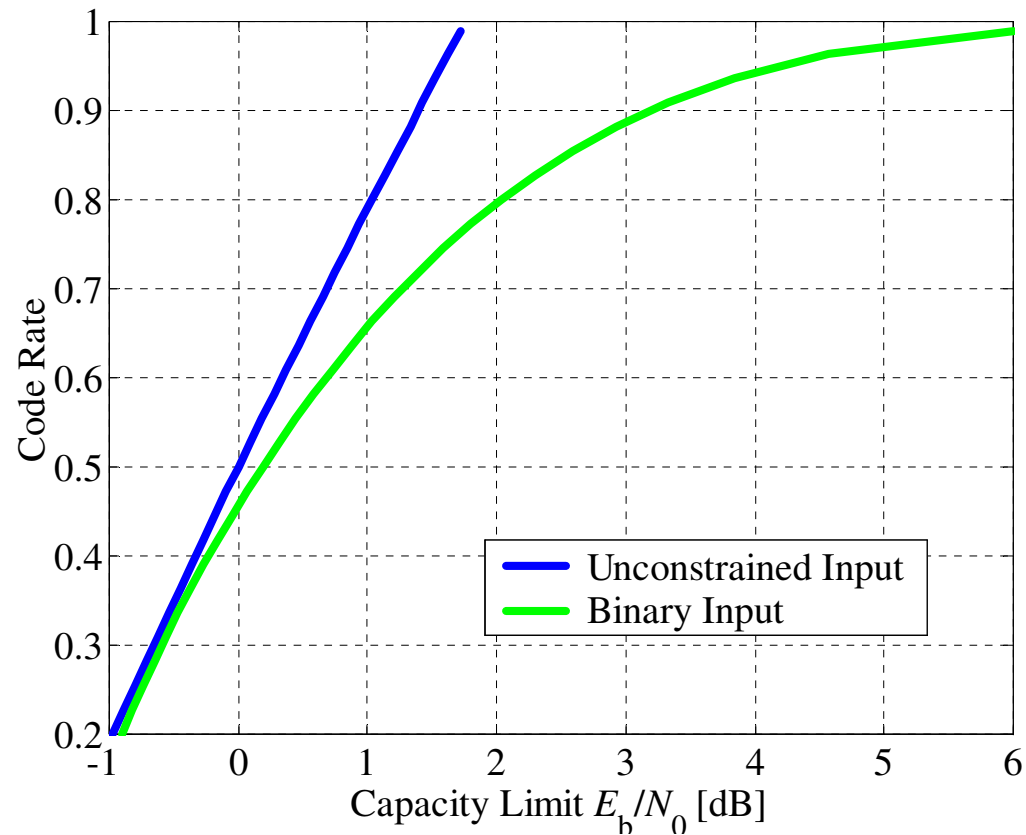
# Capacity as function of code rate - binary input (1)

Example: Binary-input (+/- A), AWGN channel

$$C = \frac{1}{2} \int_{-\infty}^{\infty} p(y|A) \log_2 \frac{p(y|A)}{p(y)} dy + \frac{1}{2} \int_{-\infty}^{\infty} p(y|-A) \log_2 \frac{p(y|-A)}{p(y)} dy$$

Constrained  
AWGN Channel,  
(From Proakis)

# Capacity as function of code rate - binary input (2)



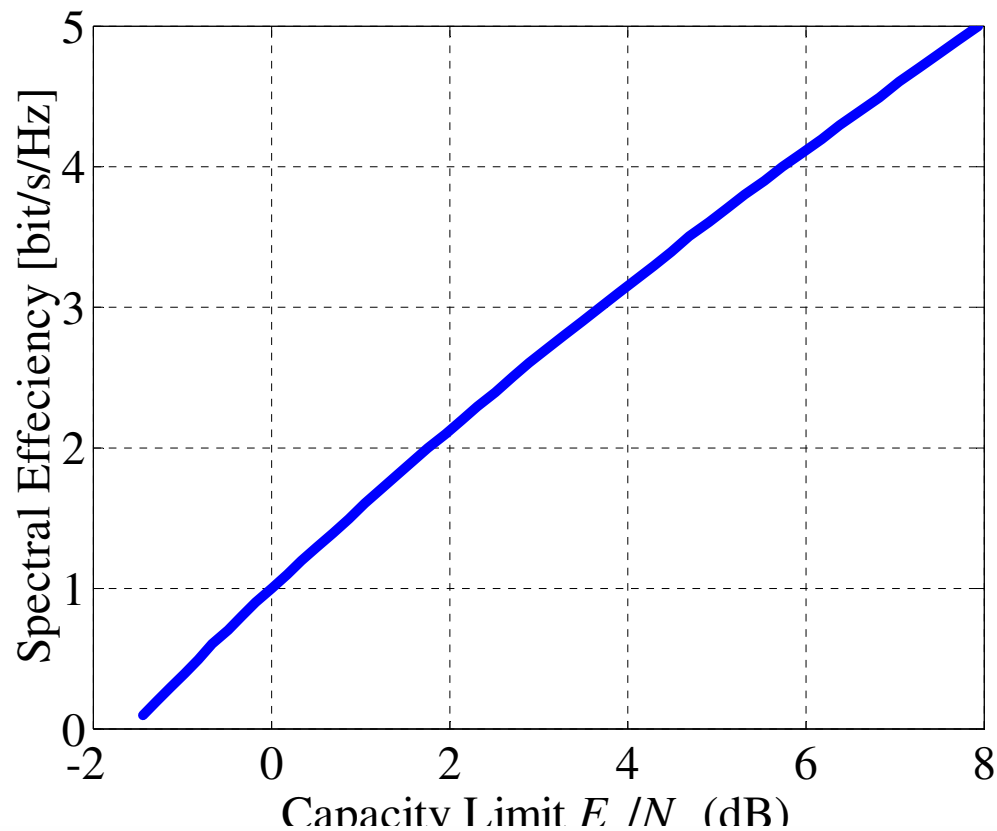
# Theoretical limit for given spectral efficiency

- Limited bandwidth,  $W$
- Data rate  $R$  (bits/s)
- Shannons capacity can be expressed as:

$$\frac{E_b}{N_0} \geq \frac{2^\eta - 1}{\eta}$$

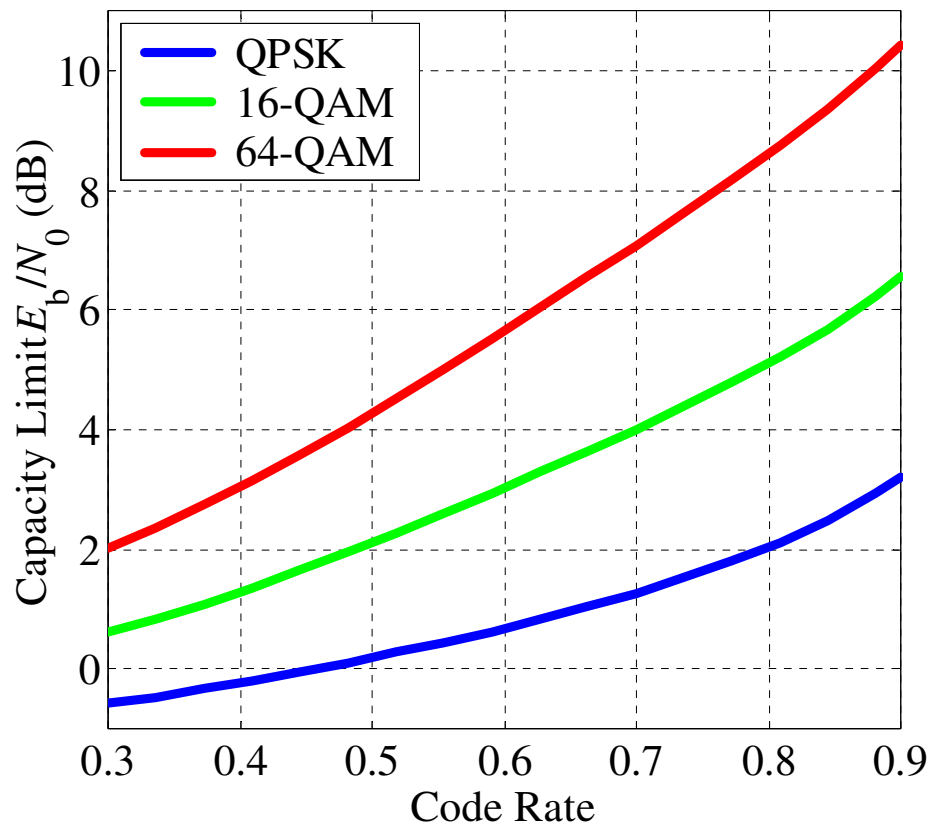
$\eta = \frac{R}{W}$  is spektral-efficiency in bit/s/Hz

# Theoretical limit for given spectral efficiency (plot)



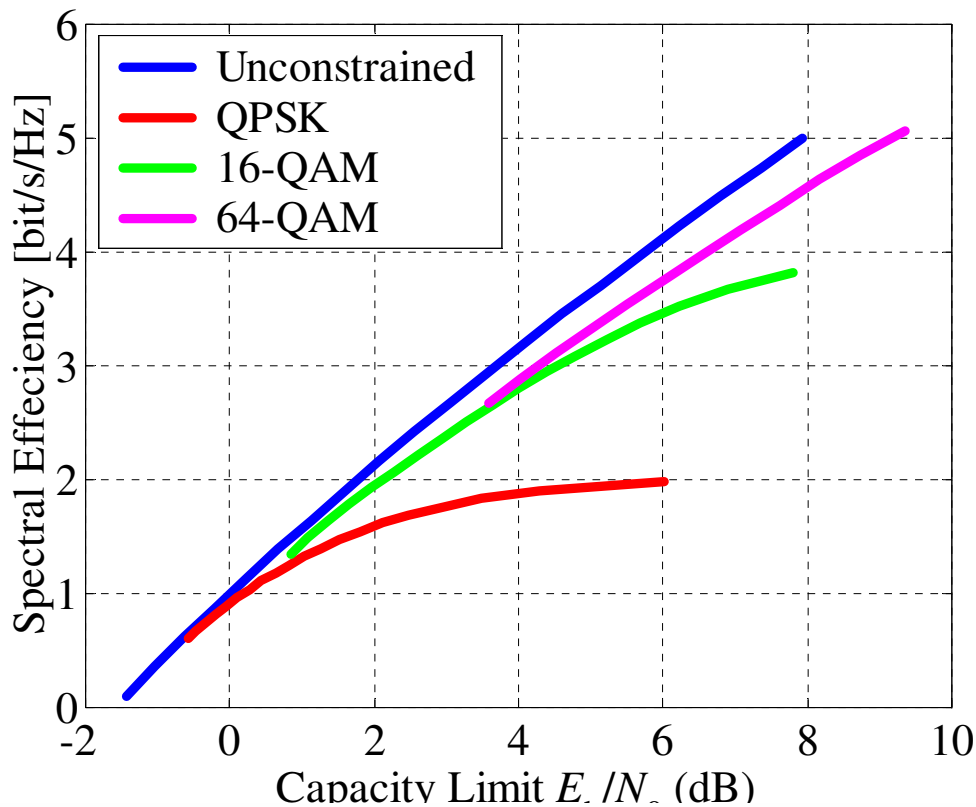
Unconstrained  
AWGN  
Channel

# Larger Modulation Alphabets- Higher Spectral Efficiency



Constrained  
Additive Gaussian  
Channel

# Capacity as function of spectral efficiency

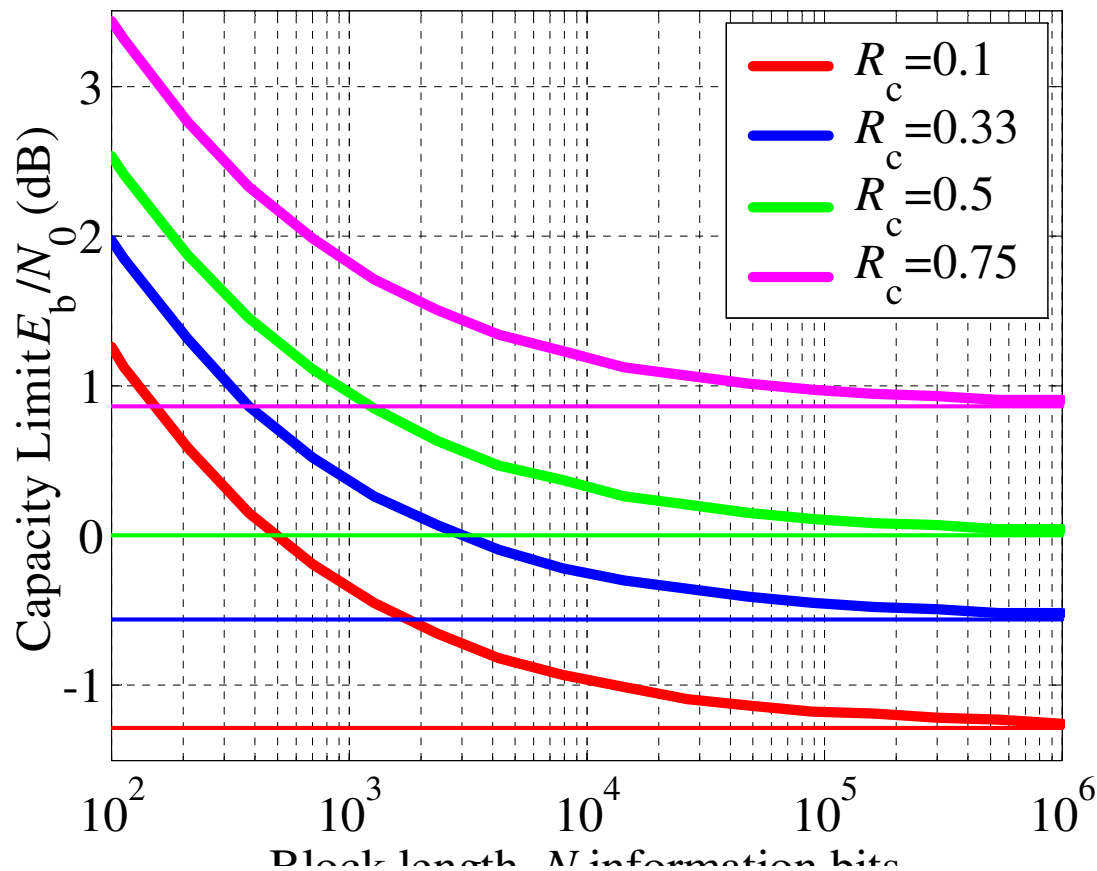


Constrained  
Additive Gaussian  
Channel

Calculation:

$$\eta = \log_2(M) * R_c$$

# Capacity as function of Packet Length



Based on paper:  
Code Performance as  
Function of Block  
Size, av Dolinar,  
Divsalar & Simon

Expression given as  
function of  $N$ ,  $R_c$  and  
 $P_w$  (Word Error  
Probability)

# *Traditional Coding Schemes*

# Basic Terms

- Code rate

$$R = \frac{k}{n} = \frac{\# \text{Information symbols}}{\# \text{Code word symbols}}$$

- Soft Decisions

- Principle idea (more or less correct/wrong)
- Erasures decoding (3 level soft decision - very simple)
- 8 level soft decision - often used in many coding schemes
- Soft decision gain: ca 2 dB for AWGN channels
- 7-9 dB possible for many fading channels

# Traditional Coding Schemes

- Block Codes

- Long Codes
- Hard desisjon
- Good at low bit error rates ( $10^{-4}$  and down)
- Many types
  - Ex. Hamming, Golay, Reed-Muller, Reed Solomon, BCH, etc
- Used for instance in CD players (RS), Intelsat (RS), Voyager (Golay)

- Convolutional Codes

- Short Codes
- Soft desisjon (Viterbi)
- Good at high bit-error rates ( $10^{-3}$  -  $10^{-4}$ )
- Used in Inmarsat, 3G and various wireless systems
  
- Long constraint length codes with sequential decoding

# Basic Block Code

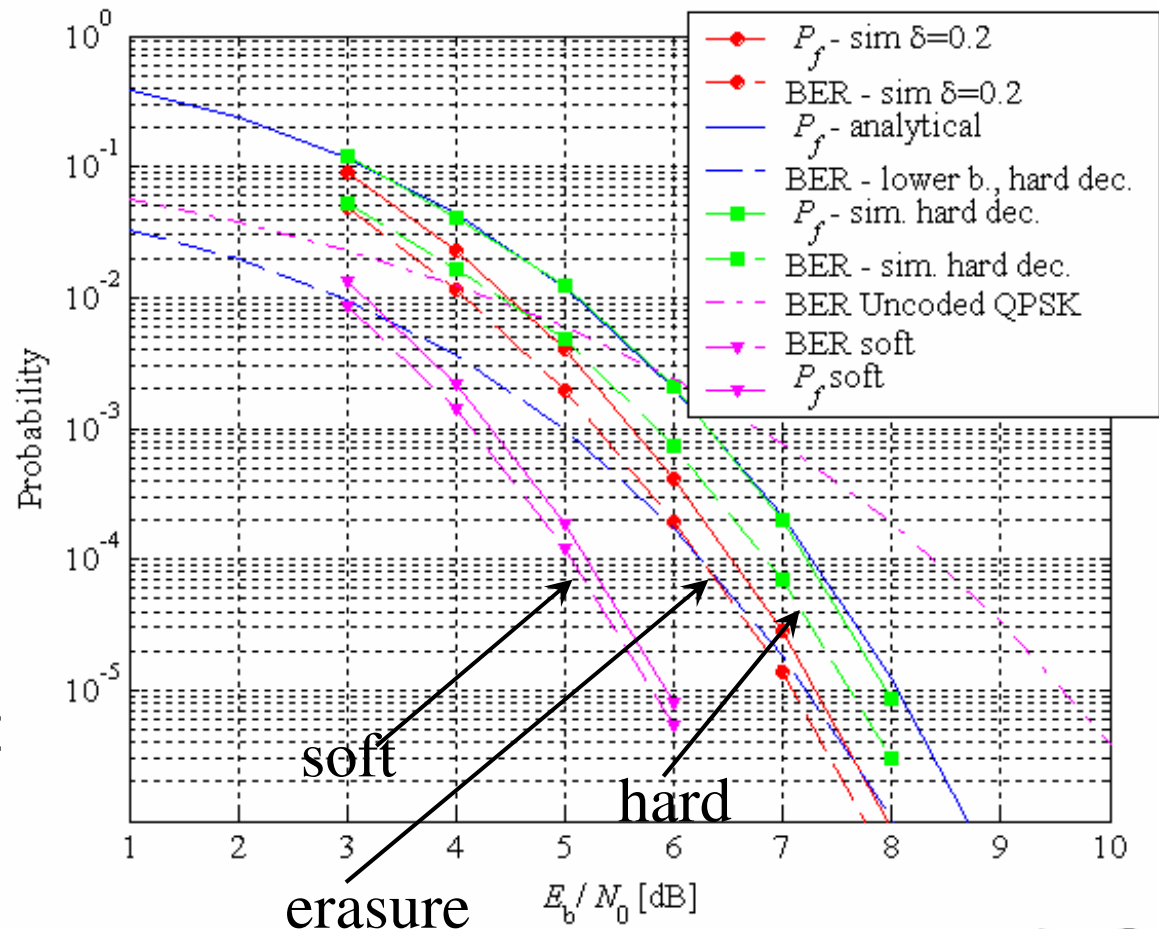
- Operates on one block at a time

$$c = mG$$

- Algebraic decoding (often)
- Soft decision decoding - high complexity
- Typically good performance at high code rates

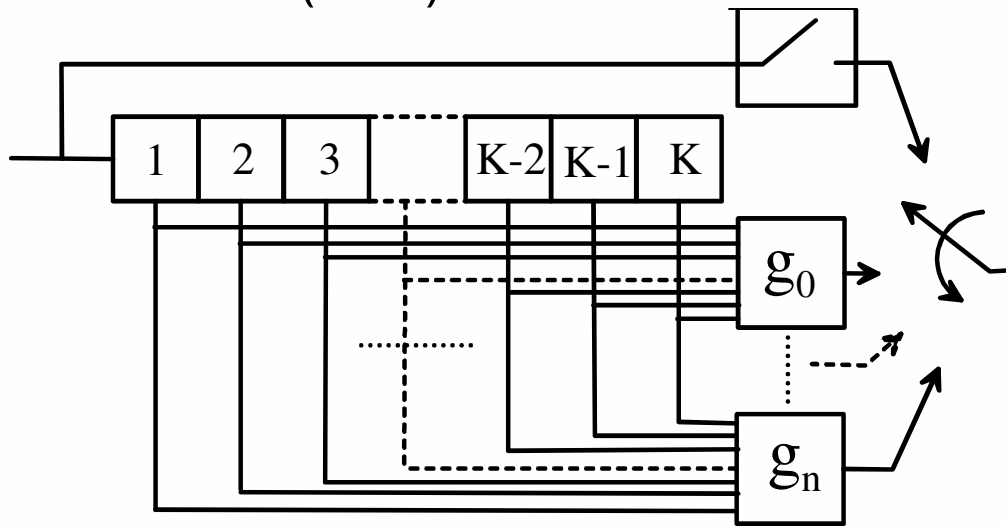
# Performance Golay Code

- Extended Golay Code (24,12)
- Hard decision
- Erasure decoding
- Soft decoding using Chase algorithm
- Used in WLL product
- Low complexity decoding



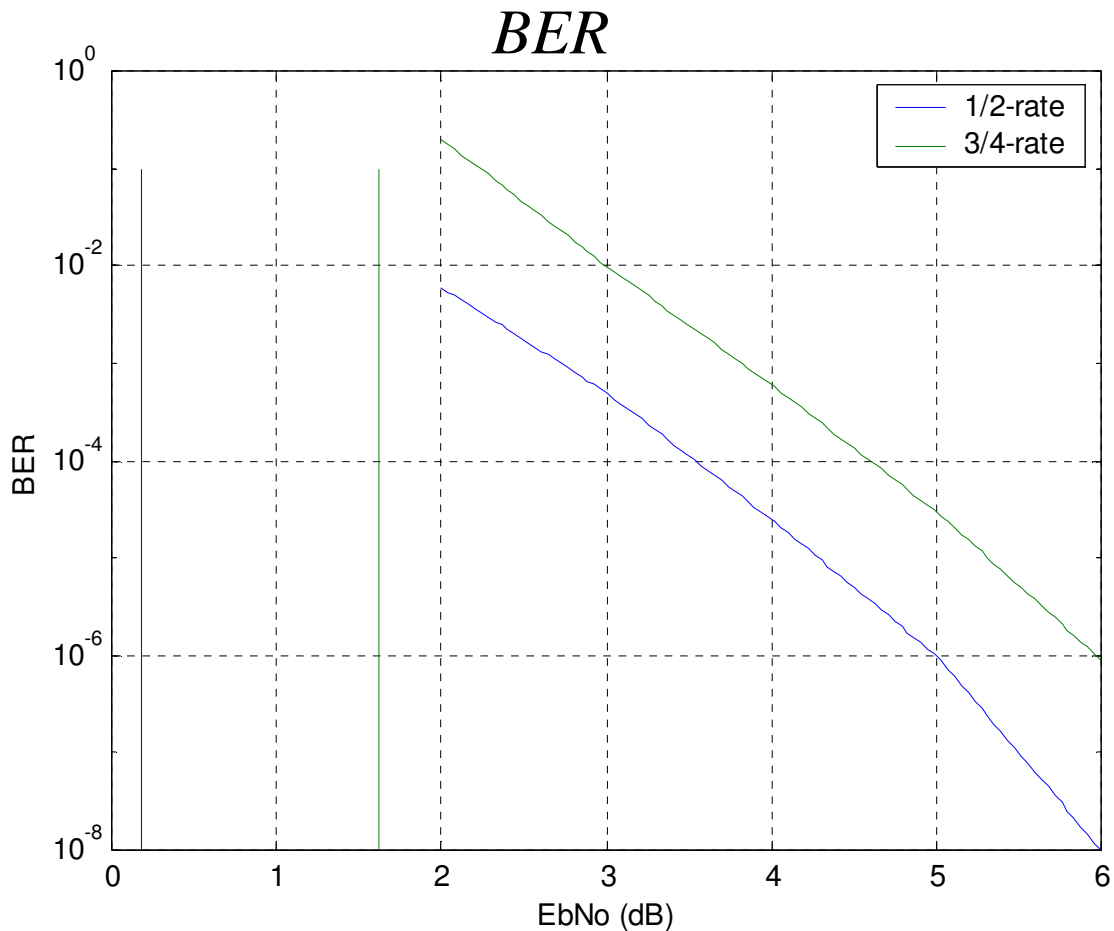
# Convolutional Codes

- Described by trellis
- Maximum Likelihood Decoding (ML) by Viterbi algorithm
- Soft Decision decoding easily implemented
- Used in very many applications, Deep Space, SatCom, various wireless systems like 3G
- Rate  $1/(n+1)$  encoder:



# Convolutional Code - BER

- K=7 Feed Forward Code
- MFD (and ODS)
- Viterbi Decoding
- Rate 3/4 obtained by puncturing rate 1/2



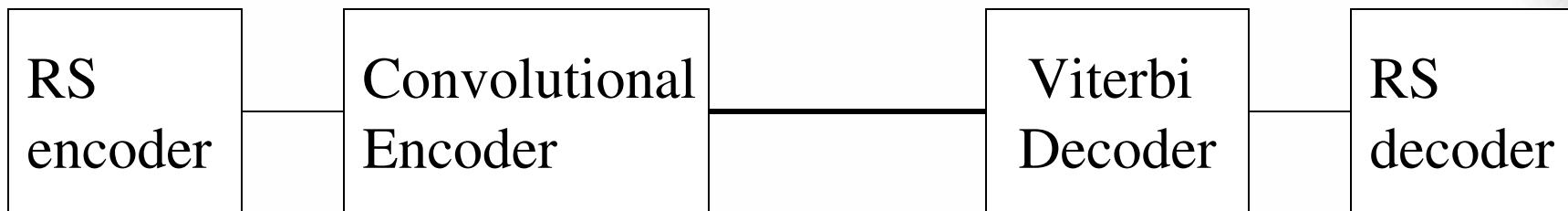
$$E_b/N_0$$

# Foldningskode - Tap

<b>Koderate</b>	<b>Yting ved <math>10^{-6}</math></b>	<b>Kapasitet Constrained Binary Input</b>	<b>Tap pga avgrensa blokk lengde</b>	<b>Tap til Constrained input Grense</b>
$1/2$	<b>5.0</b>	<b>0.2</b>	<b>??</b>	<b>4.8</b>
$3/4$	<b>6.0</b>	<b>1.6</b>	<b>??</b>	<b>4.4</b>

- Implementert i ASIC
- Relativt stort tap til kapasitetsgrensa
- Blokk lengde - vanskelig å definere

# Concatenated Coding



- Traditional scheme for very low error rate
- Typically RS + Convolutional
- Viterbi - soft decisions
- RS burst error correction
- Viterbi gives moderate BER where RS takes over and brings it further down
- Long Code with practical complexity

# Alternative to Concatenation

- Use a very long constraint length ( $K$ ) convolutional code
- Typically -  $K=30-50$
- Error rate decreases exponentially with constraint length
- Viterbi decoding:
  - $2^{30} \sim 10^9$  states
- **NOT IMPLEMENTABLE**

- **Solution: Sequential Decoding**
  - Limited but smart search
  - Search the most likely paths
  - Complexity depends on channel conditions
  - Can calculate conditions for when decoding is possible

# Sekvensiell dekoding

<b>Koderate</b>	<b>Pareto eksponent lik 1 ved:</b>	<b>Kapasitet Constrained Binary Input</b>	<b>Tap pga avgrensa blokkengde</b>	<b>Tap til Constrained Grense</b>
$1/2$	<b>2.2 dB</b>	<b>0.2 dB</b>	<b>??</b>	<b>2 dB</b>
$3/4$	<b>3.7 dB</b>	<b>1.6 dB</b>	<b>??</b>	<b>2.1 dB</b>

- $K=36$ ,  $R=1/2$  Implementert i DSP
- Problem: Overflyt i buffere

# Anvendelser i Nera Produkter

- Inmarsat M&B
  - Foldningskode  $K=7$  (1/2 og 3/4-rate)
  - Sekvensiell dekoding  $K=36$  (1/2 rate)
- Nera World Communicator
  - Turbo 1/2-rate med 16-QAM
- DVB-RCS
  - Foldningskode og Reed-Solomon (255,239,8)
  - Turbo
- BGAN (next generation mobile satcom terminals)
  - Turbo 16 tilstander

*New iterative capacity  
approaching schemes*

# Turbo Codes

ICC 1993 - Presentation of Turbo Codes  
- a huge step towards the Shannon limit

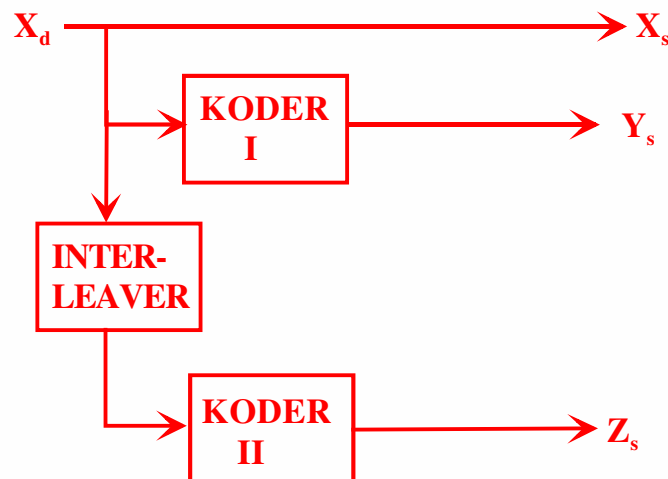
- Convolutional Turbo:
  - Parallel Concatenated Convolutional (PCC) codes
  - Serially Concatenated Convolutional (SCC) Codes
  - Separated by interleaver
  - Soft in and soft out, iterative decoding
- Block based Turbo:
  - Turbo Product Codes (TPC)
  - PA-Codes
  - LDPC Codes
  - Soft decision, iterative decoding

Long codes, soft decision, iterative decoding

# PCC Turbo Principle

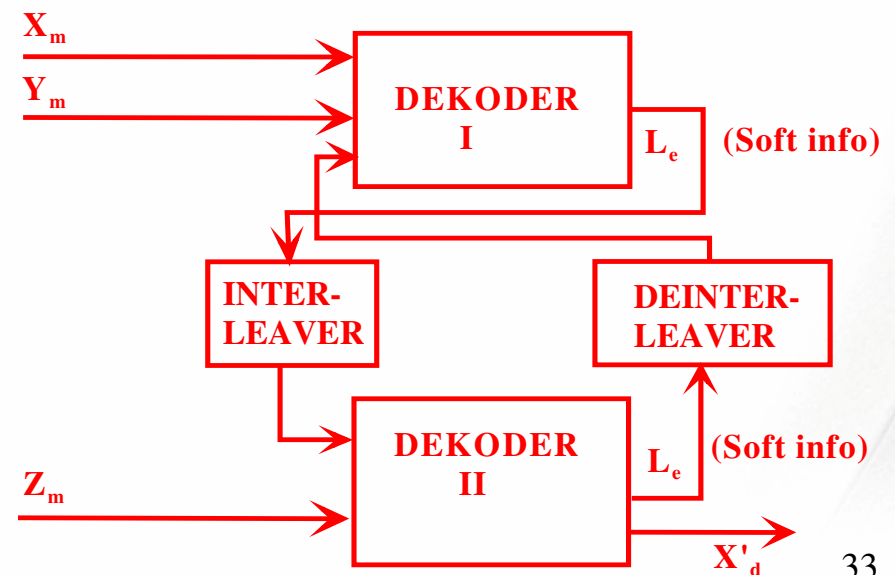
- Encoder

- Recursive convolutional encoders
- Interleaver essential



- Decoder

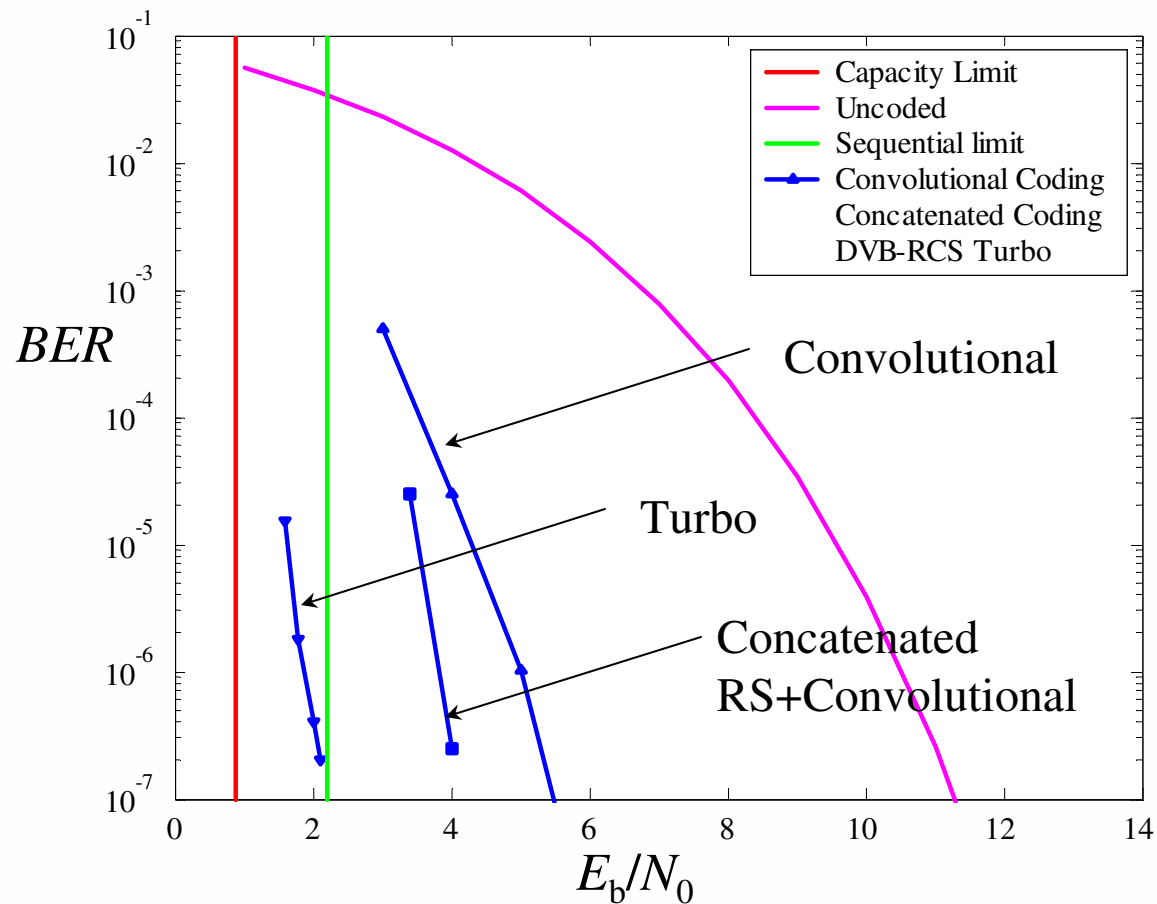
- Soft in soft out
- Many iterations



# PCC codes - properties

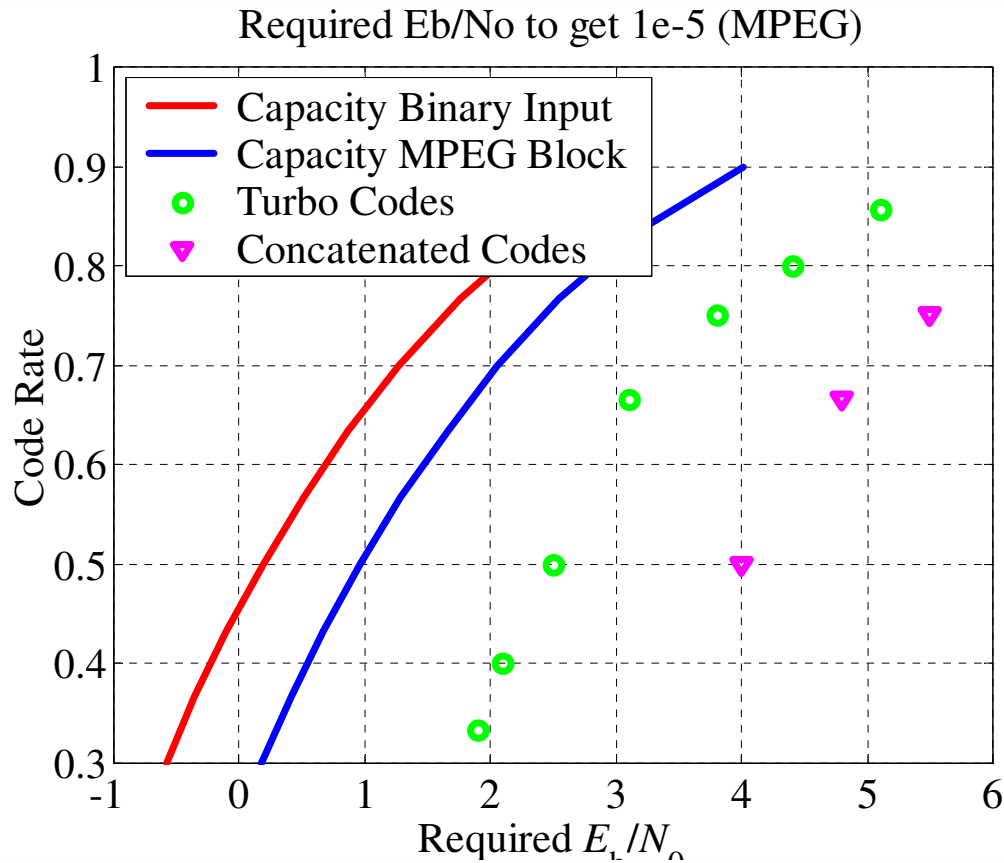
- The "original" Turbo code as presented by Berrou in 1993
- Good overall performance, also at  $10^{-3}$
- Good convergence of iterative decoder (few iterations necessary)
- Used in:
  - BGAN (16-states)
  - UMTS (8-states)
  - DVB-RCS (8-states, duo-binary)
- The above codes must be *punctured* to get high rate => affects BER performance

# Performance Example



- MPEG block lengths (188 bytes)
- $R=1/2$

# DVB-RCS



**Code Performance Comparison for MPEG (1 packet) and PER=10<sup>-5</sup>**

# Iterative decoding - Block Codes

- Turbo Product Codes (TPC)
- Product Accumulate Codes
- Low Density Parity Check Codes (LDPC)
  
- Nera: Theoretical Studies and Simulations
- Interesting because:
  - Typically better than convolutional based Turbo codes at high code rates
  - Fewer patents
  - TPC included in *IEEE802.16* standard
  - PA codes - low complexity
  - LDPC has “World Record” 0.005 dB from Shannon
  - Complexity -> high-capacity systems

# Turbo Product Codes (TPC)

- Two (or more) block codes concatenated
- Soft in soft out, iterative decoding
- Component codes - e.g. BCH

$d_{11}$	$d_{12}$	$d_{13}$	$d_{14}$	$d_{15}$	$p_{16}$	$p_{17}$
$d_{21}$	$d_{22}$	$d_{23}$	$d_{24}$	$d_{25}$	$p_{26}$	$p_{27}$
$d_{31}$	$d_{32}$	$d_{33}$	$d_{34}$	$d_{35}$	$p_{36}$	$p_{37}$
$p_{41}$	$p_{42}$	$p_{43}$	$p_{44}$	$p_{45}$	$p_{46}$	$p_{47}$

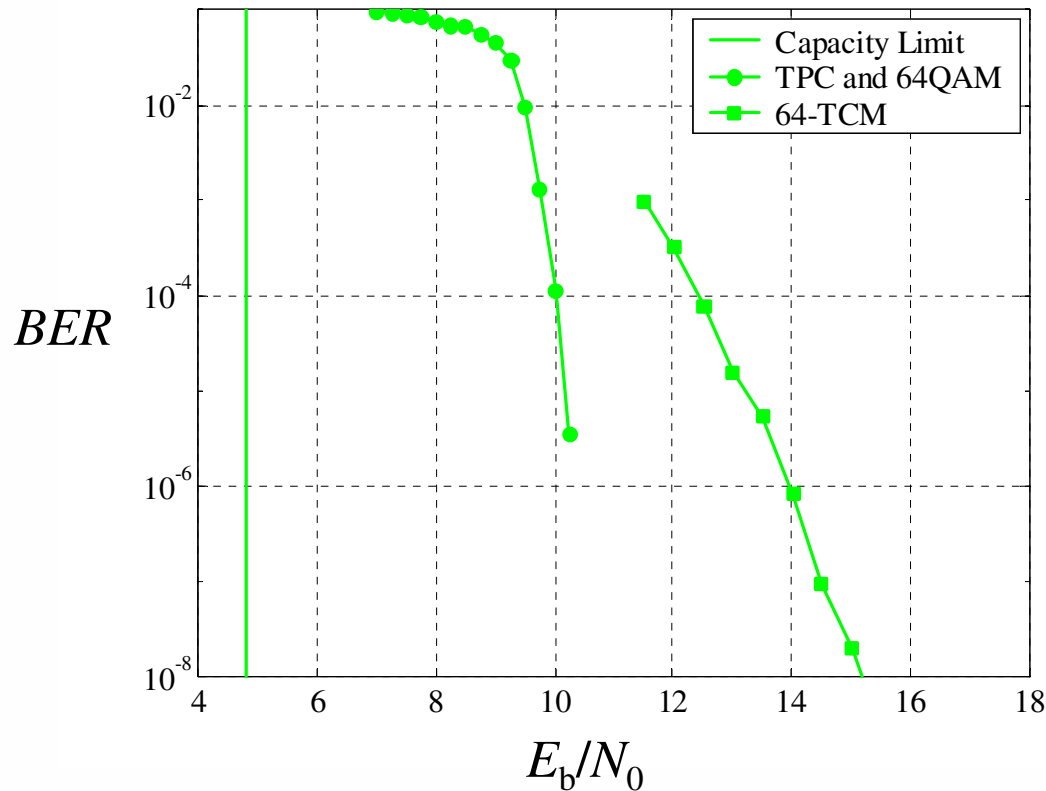
# Ytelse TPC

- Simulert med AWGN, QPSK and 16QAM
- Ytelse ved  $10^{-5}$  BER

<b>(TPC) Koderate</b>	<b>Ytelse ved <math>10^{-5}</math></b>	<b>Kapasitet Constrained Binary Input</b>	<b>Blokk lengde (kodet)</b>	<b>Ekstra tap Blokk lengde</b>	<b>Tap til Praktisk Grense</b>
<b>0.66</b>	<b>3.0 dB</b>	<b>1.2 dB</b>	<b>1024 (32x32)</b>	<b>1.0 dB</b>	<b>0.8 dB</b>
<b>0.79</b>	<b>3.3 dB</b>	<b>2.0 dB</b>	<b>4096 (64x64)</b>	<b>0.5 dB</b>	<b>0.8 dB</b>
<b>0.79</b>	<b>6.8 dB</b>	<b>5.1 dB</b>	<b>4096 (64x64)</b>	<b>0.5 dB</b>	<b>1.3 dB</b>

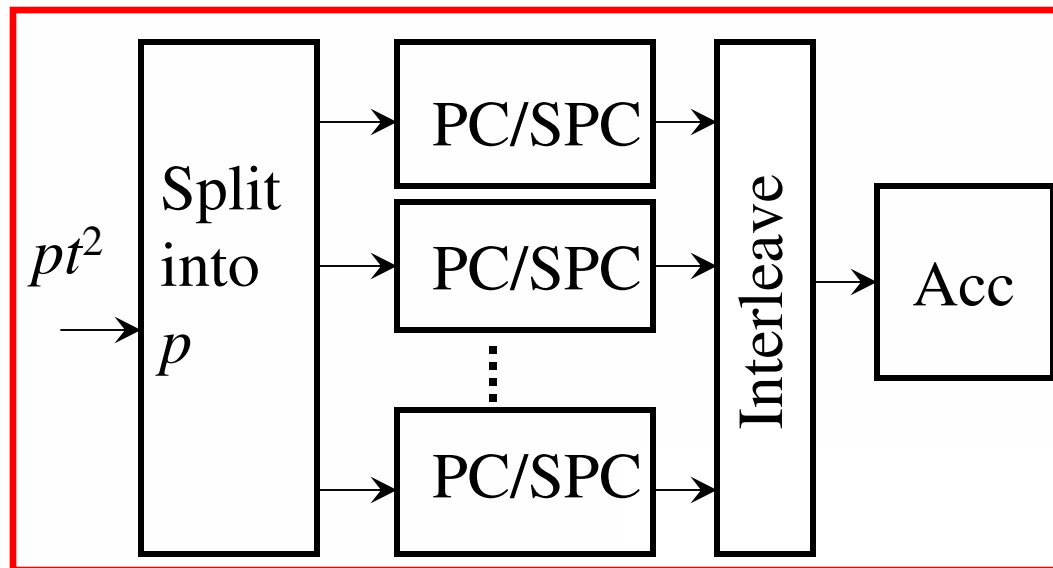
# TPC Performance vs TCM

TCM and TPC with 64 QAM, comparable spectral efficiency ((64,57) TPC code)



- Good at high code rates
- Interesting for radio link systems
- In *IEEE802.16* standard

# Product Accumulate Codes



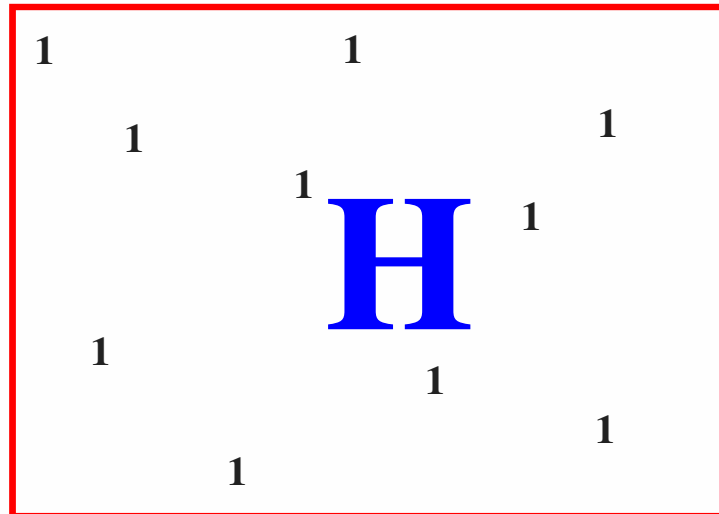
# PA code - properties

- A low complexity scheme, presented in 2001
- PA-codes have good overall performance
- No puncturing, assumed to have better performance at low BER
- Few/no patents
- Slower convergence than PCC
  - PA-I
  - PA-II
  - Generalised PA- codes (for lower rates)

# Low Density Parity Check (LDPC) Codes

- Block Code
- Iterative decoding

$$c = mG \quad GH^T = 0$$



# LDPC codes -properties

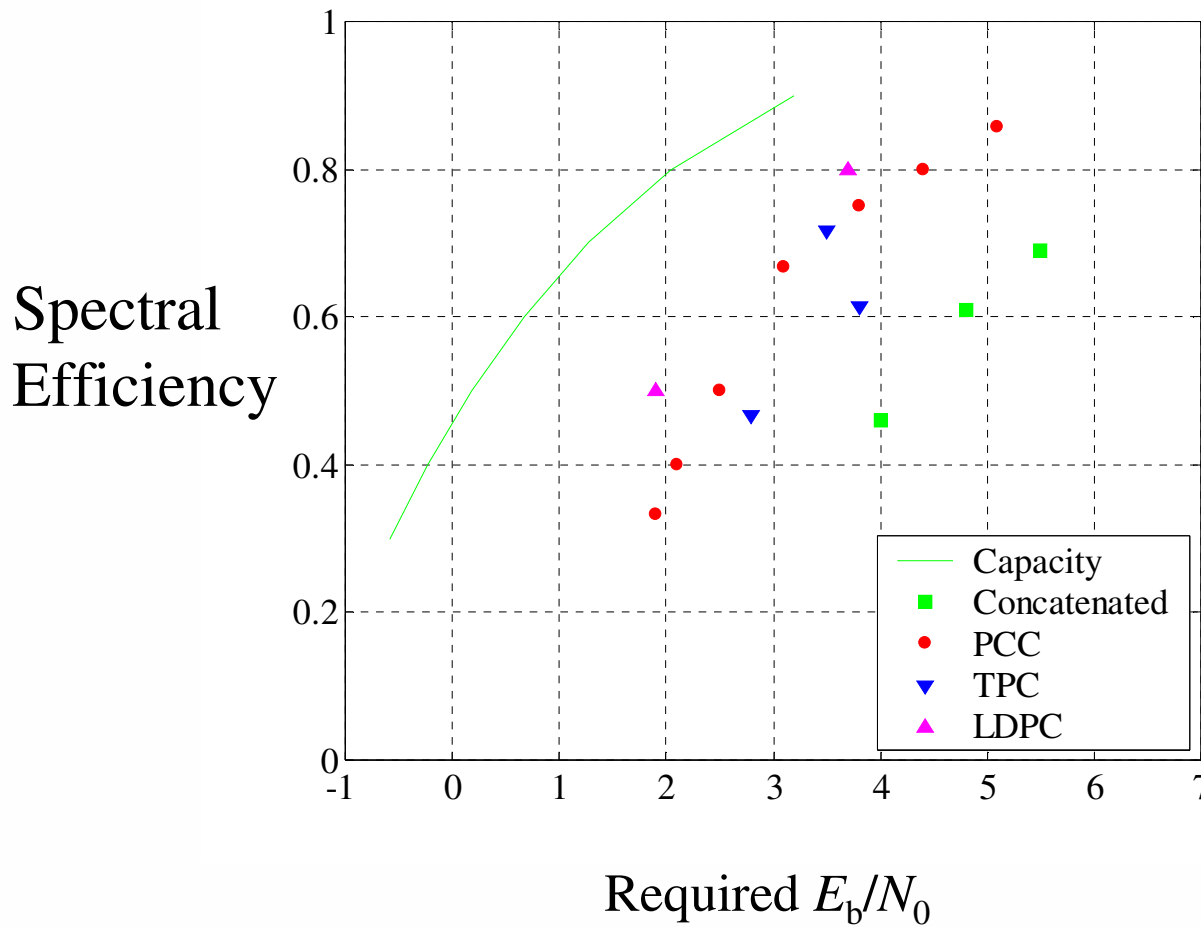
- Proposed by Gallager i 1963
- Good performance, especially for high code rates and long block lengths
- 0.0045 dB from Shannon limit!!
- Low decoder complexity
- Few (no?) patents
- Disadvantages:
  - Some error flattening for some codes
  - Much ongoing research
  - Implementation attempts started

# Ytelse - LDPC koder

- Simulert ytelse, BPSK/QPSK, AWGN
- ATM og MPEG blokker
- Regulære LDPC koder, BER=10<sup>-5</sup>

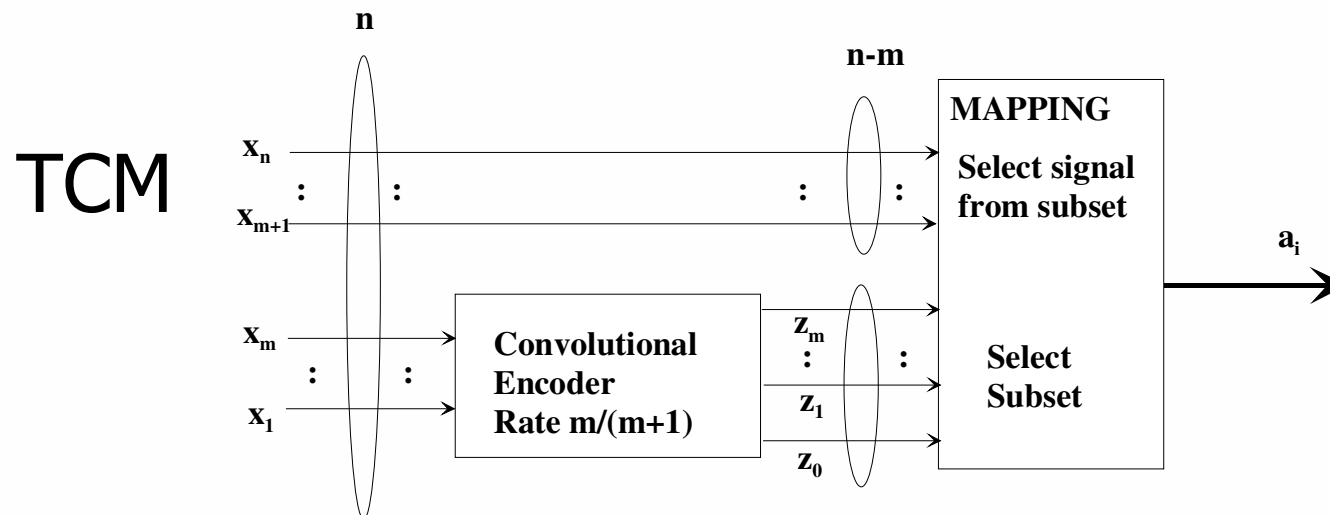
<b>(LDPC) Koderate</b>	<b>Ytelse ved 10<sup>-5</sup></b>	<b>Kapasitet Constrained Binary Input</b>	<b>Blokklengthe (kodet)</b>	<b>Ekstra tap Blokklengthe</b>	<b>Tap til Praktisk Grense</b>
<b>1/2</b>	<b>1.8 dB</b>	<b>0.2 dB</b>	<b>1504 MPEG</b>	<b>0.7 dB</b>	<b>0.9 dB</b>
<b>4/5</b>	<b>3.7 dB</b>	<b>1.6 dB</b>	<b>1504 MPEG</b>	<b>0.7 dB</b>	<b>1.4 dB</b>
<b>1/2</b>	<b>2.8 dB</b>	<b>0.2 dB</b>	<b>424 ATM</b>	<b>1.2 dB</b>	<b>1.4 dB</b>
<b>4/5</b>	<b>4.5 dB</b>	<b>1.6 dB</b>	<b>424 ATM</b>	<b>1.2 dB</b>	<b>1.7 dB</b>

# Performance Example LDPC Codes



- $PER=10^{-5}$
- $BER=10^{-5}$  for LDPC
- MPEG packets

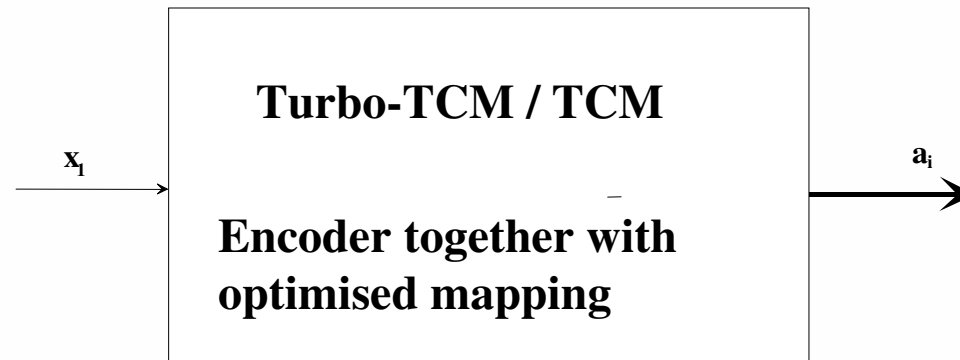
# Mapping to higher order constellations



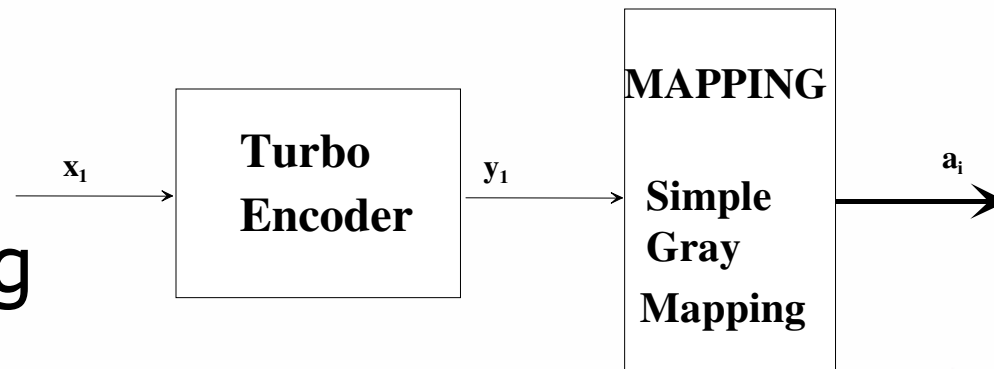
- Optimised mapping necessary in order to achieve coding gain
- Effective “block length” of code is short

# Mapping to higher order constellations

Turbo-TCM  
/ TCM



Encoder +  
Gray mapping

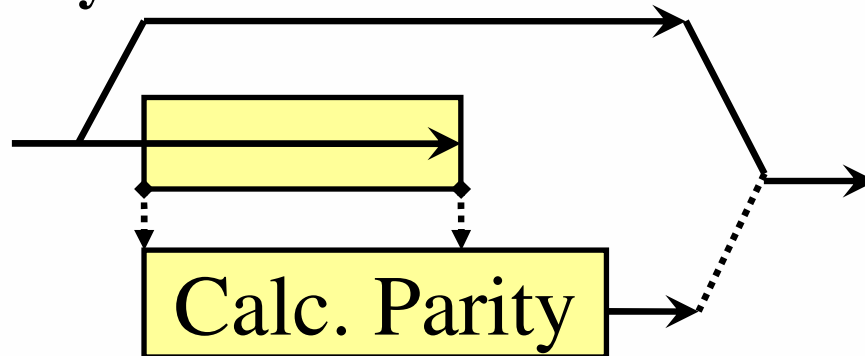


# Mapping

- Turbo + Gray mapping works well, because
  - Code is long and give good coding gain anyway
  - Distance properties of individual symbols in the code is less important
  - Also more flexible with respect to
    - Modulation schemes
    - Code rate
  - Confirmed by several papers

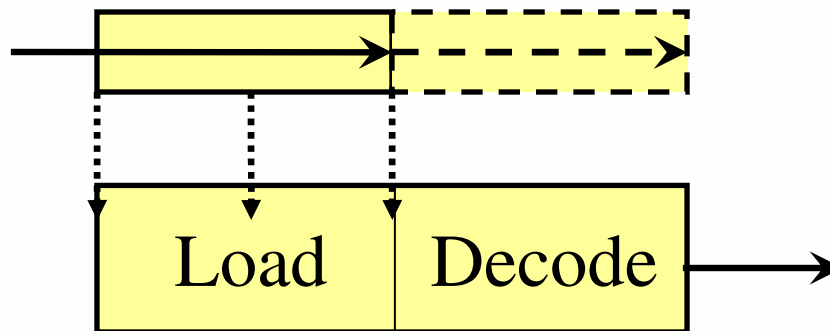
# Block Length and Delay

**Tx-delay**



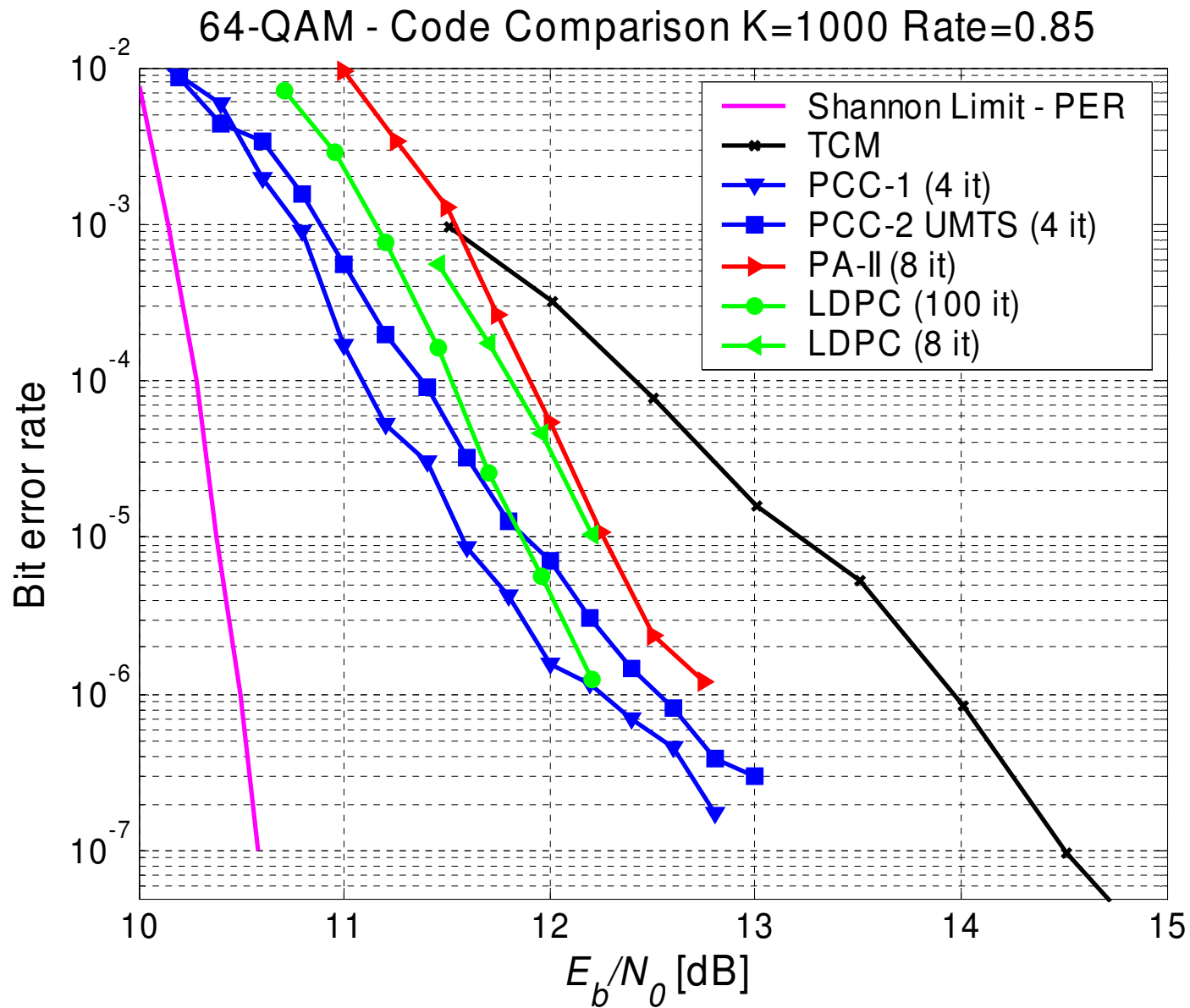
*Assuming systematic encoding (block code)*

**Rx-delay**



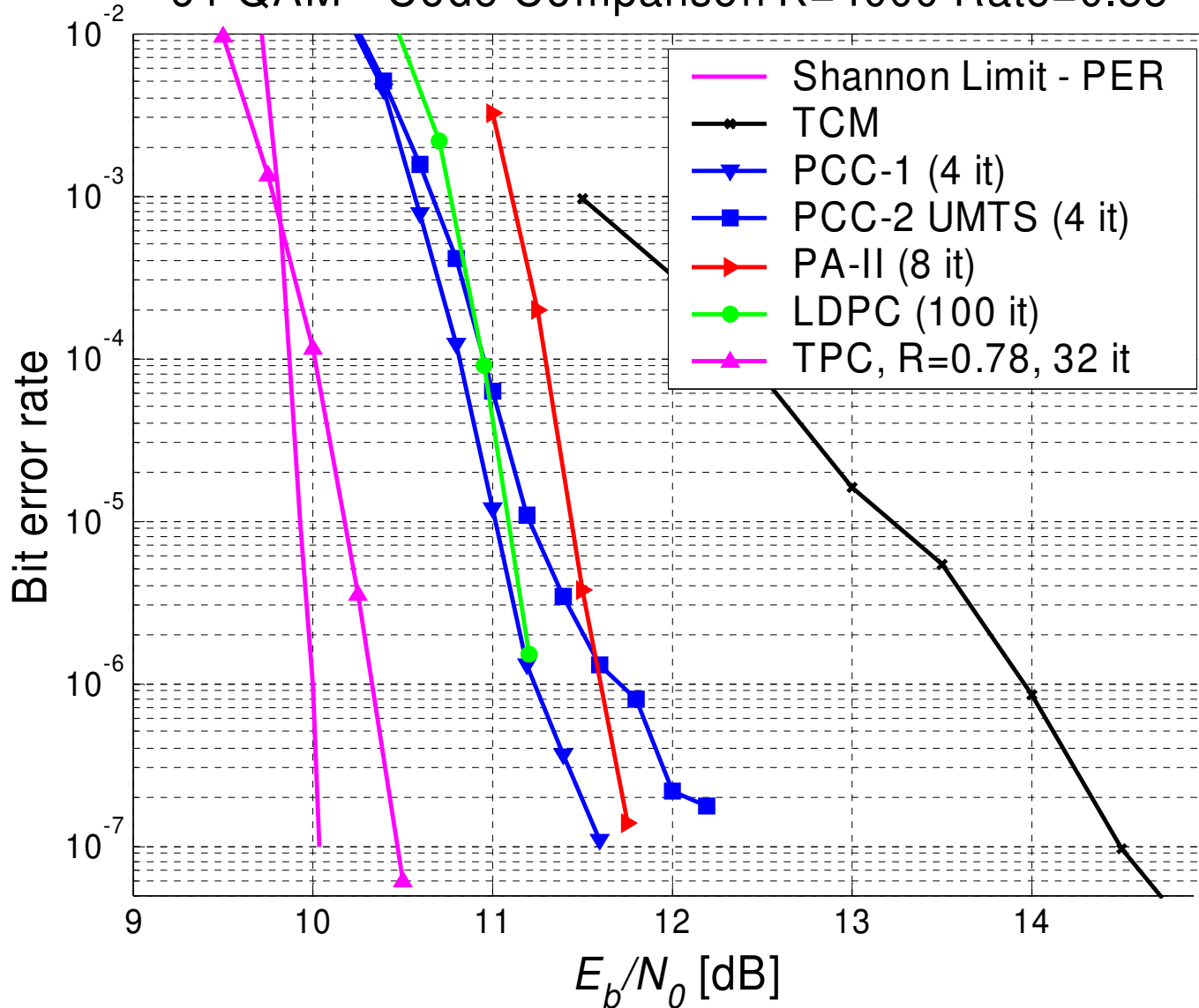
*Release data before new block has arrived*

# BER - 64QAM, $K=1000$ , $R=0.85$



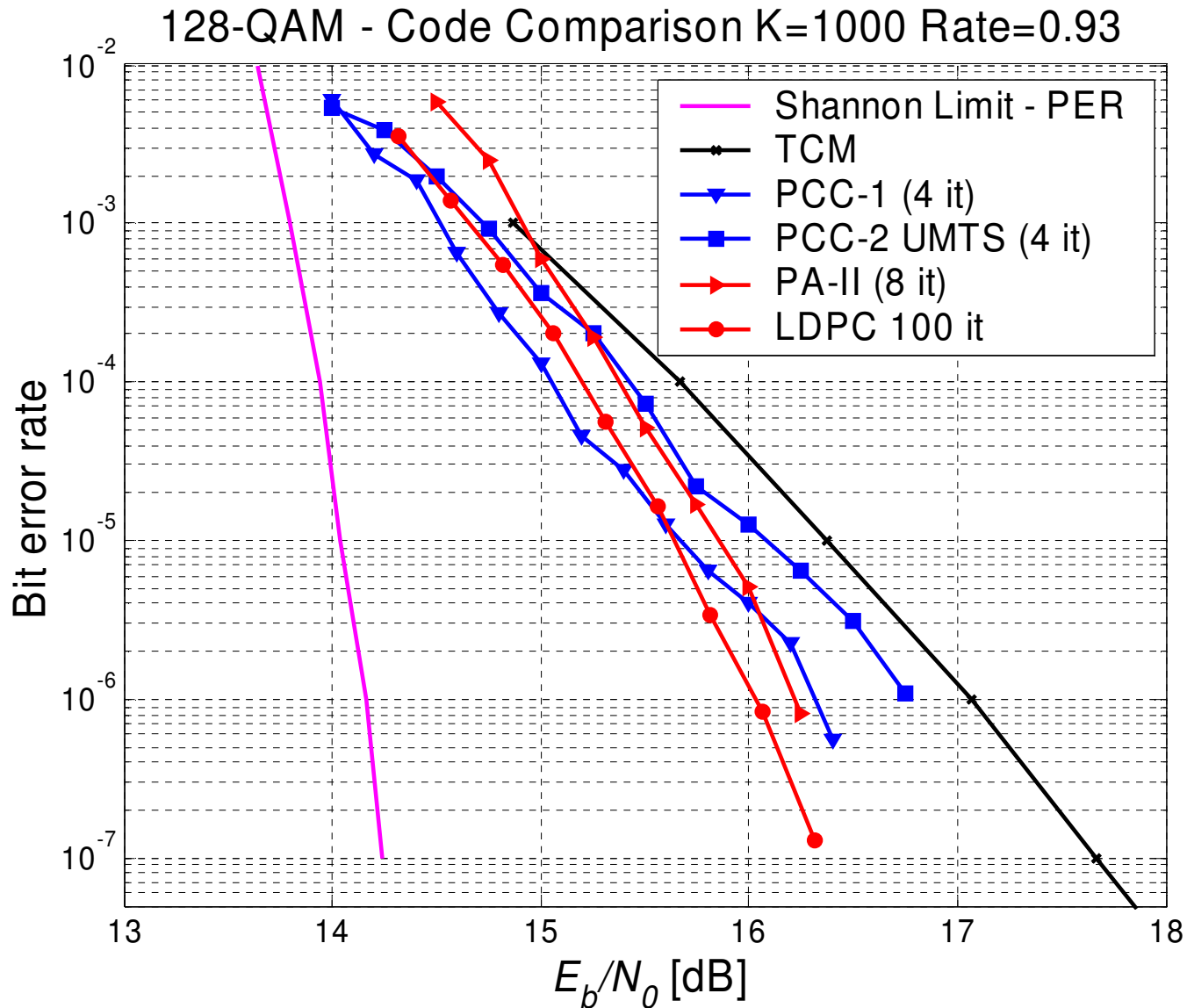
# BER - 64QAM, $K=4000$ , $R=0.85$

64-QAM - Code Comparison  $K=4000$  Rate=0.85



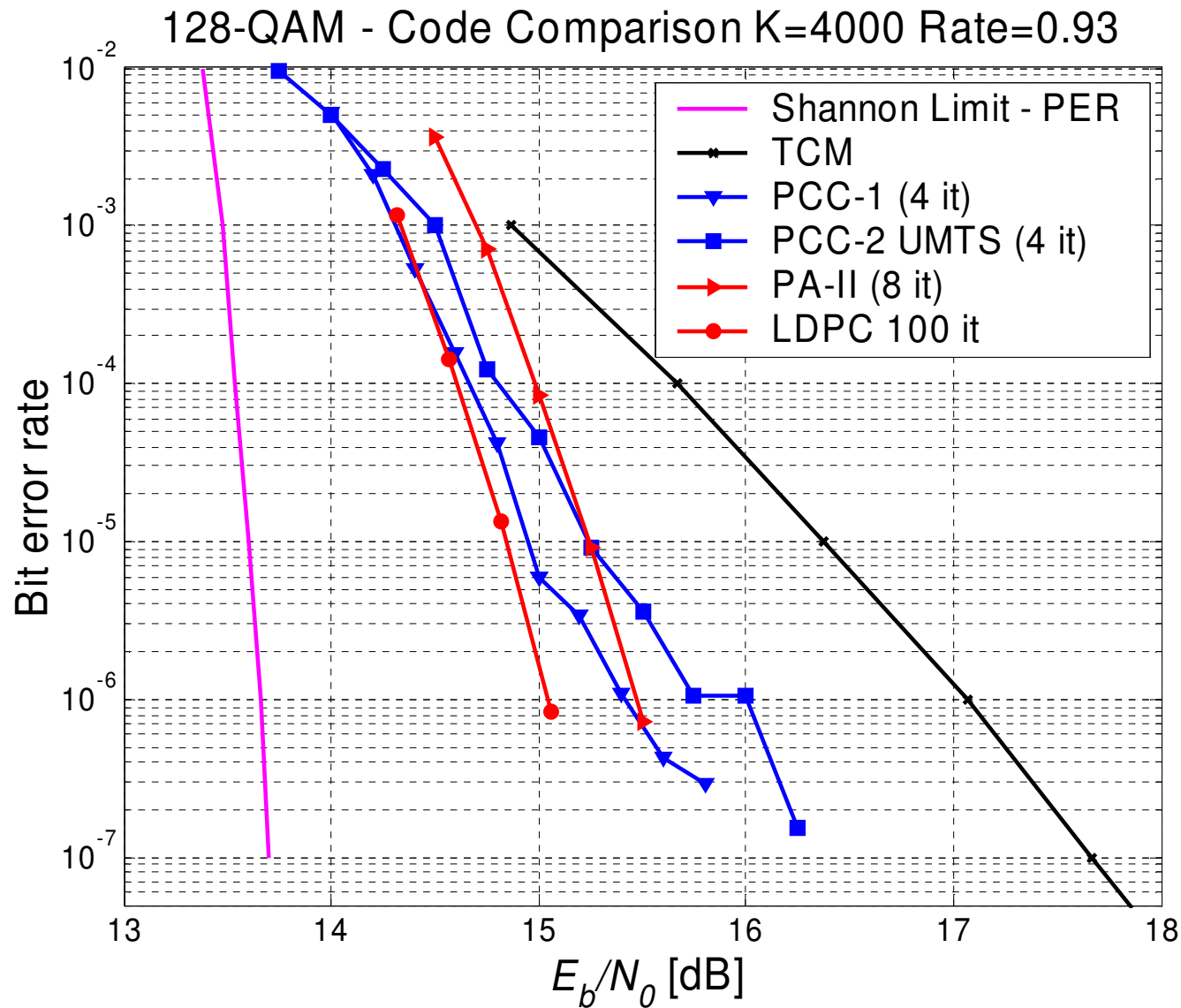
Note:  
 $K=3249$  and  
 $R=0.78$  for  
TPC code

# BER - 128QAM, $K=1000$ , $R=0.93$



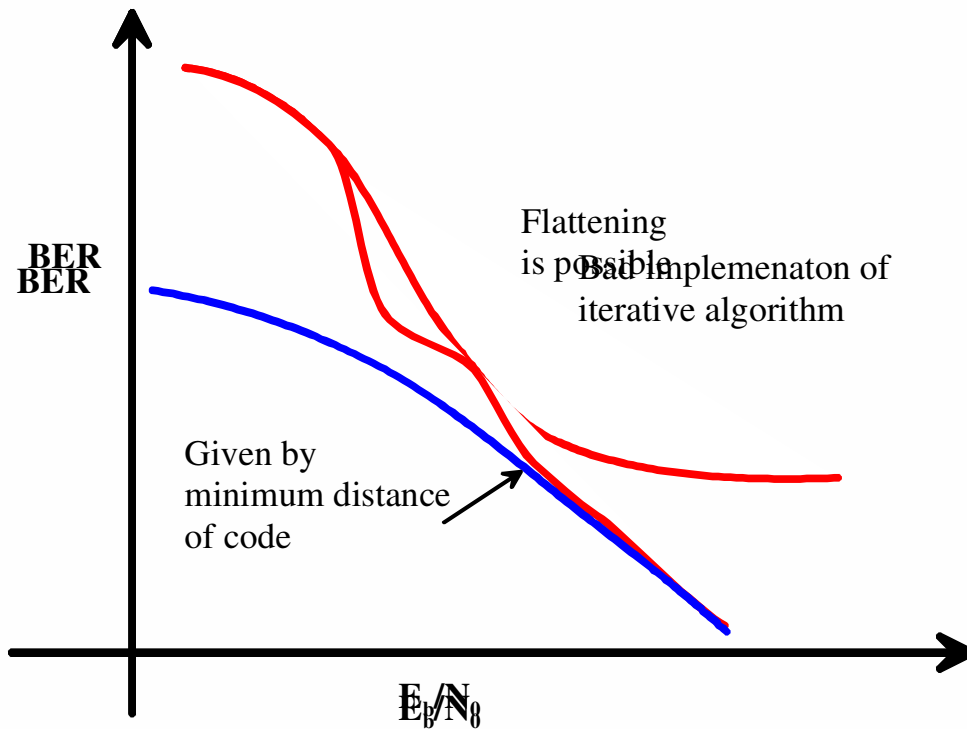
Note:  
 $K=1458$  for  
PA-II

# BER - 128QAM, $K=4000$ , $R=0.93$



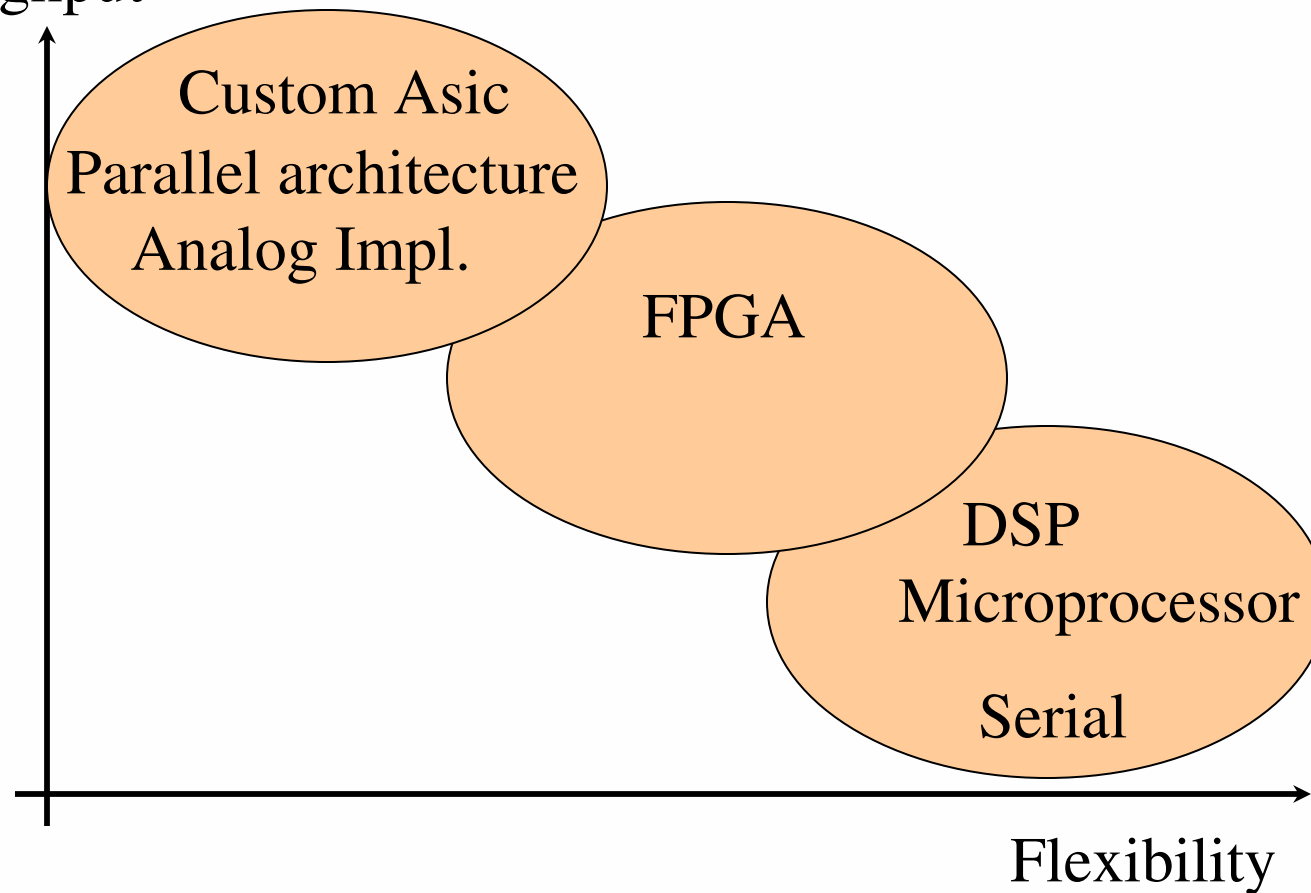
Note:  
 $K=3645$  for  
PA-II

# Evaluation of Iterative Decoding

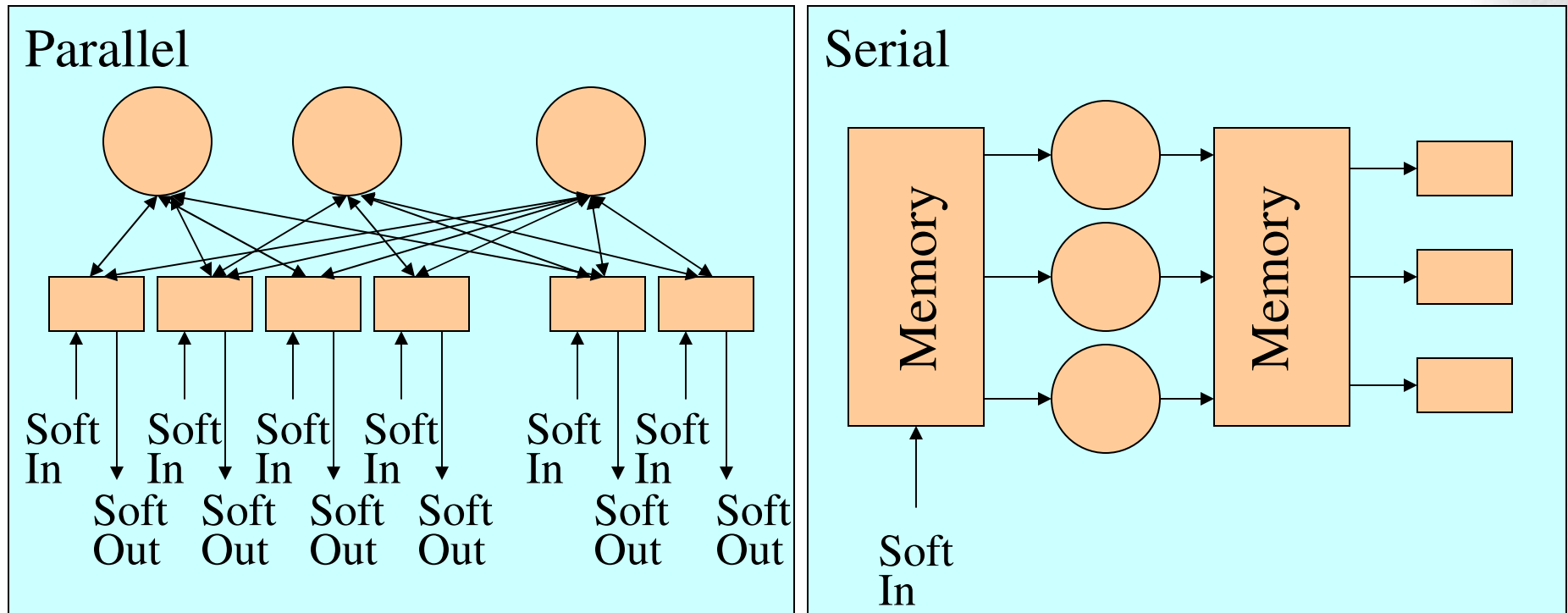


# Implementation Aspects of Iterative Decoding Schemes

Throughput



# Implementation Example LDPC



Routing limitation

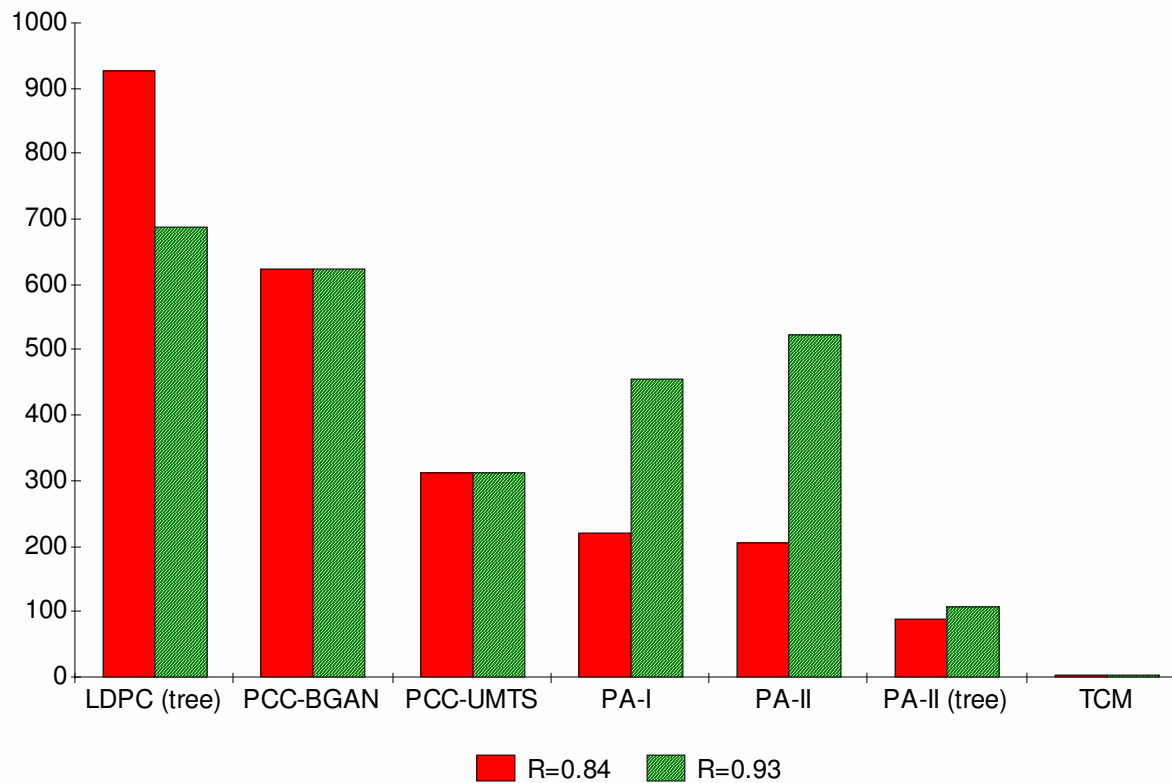
Large area

Power and throughput efficient

Limitation:

- Memory and memory access
- Serial execution

# Decoding Complexity of Coding Schemes



Complexity of coding schemes in # of max-log or min-sum operations pr decoded bit

# Systems with Turbo/Iterative Coding Schemes

System	Coding Scheme	Typical rates
DVB-RCS	PCC code, 8 state, duo-binary	128k-3Mbit/s
IEEE802.16	Turbo Product Code	25Mbit/s
UMTS/3G	PCC code, 8 state	384kbit/s
DVB-S2	LDPC code + BCH	<40MSymb/s
BGAN	PCC code, 16 state	≤512kbit/s

- Considered also for Storage (1Gbit/s) and Optical systems (10Gb/s)

# Choice of Coding Scheme

- Coding Scheme - Chosen to Fulfil System/Application Requirements
  - Performance - BER, PER
  - Delay - Block Length
  - Spectral Efficiency - Code Rate
  - Throughput - Complexity
  - Flexibility - Scalability - Adaptivity
  - Channel Type - Mobile, Fixed, Burst Error etc

# Conclusion

- For practical systems we can not achieve the -1.6 dB limit
- “Practical limit” - depend on rate, constellation, block length
- New techniques with iterative decoding approach capacity
- Mapping not so critical for long codes
- For High Data Rates - Complexity is a Concern for real time implementation

# References

For more details on the topic of this presentation, the reader is referred to the following publications (and the references therein):

- P. Orten and B. Risløw, “Theory and practice of error control coding for satellite and fixed radio systems,” in *Teletronikk Journal*, No. 1, 2002 (can be found at [www.unik.no/~porten](http://www.unik.no/~porten))
- T. Flo, P. Orten, B. Risløw, “Evaluation of coding schemes for spectrally efficient low-delay radio systems,” in *Proceedings of 3rd International Symposium on Turbo Codes & Related Topics*, Brest, France, September, 2003, pp. 387-390.