

# EXIT Charts

JASS05 –Course 4:

“The Turbo Principle in Communications”

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# Overview

- **Why EXIT Charts?**
- **How EXIT Charts work?**
- **How to draw EXIT Charts?**
- **Where to use EXIT Charts?**
- **Summary and Outlook**

# Why **Extrinsic Information Transfer Chart**?

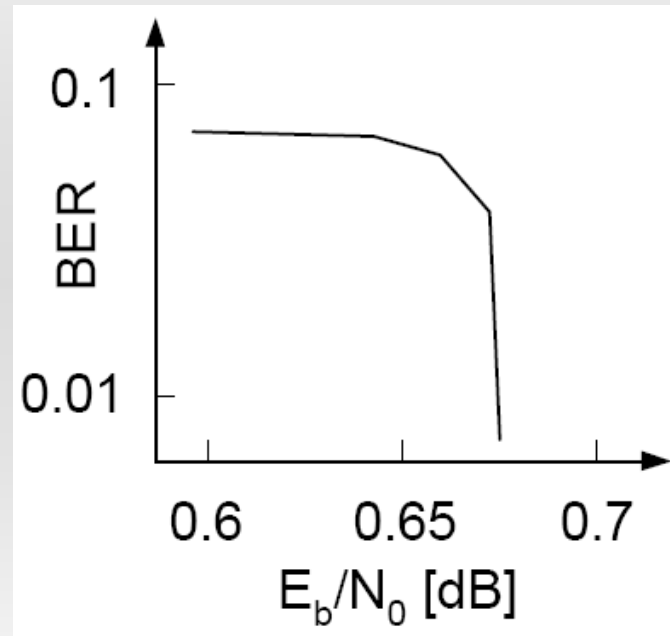
The problem with Bit Error Rate Chart when iteratively decoding

Bad performance

- Low  $E_b/N_0$  region
- Turbo cliff region

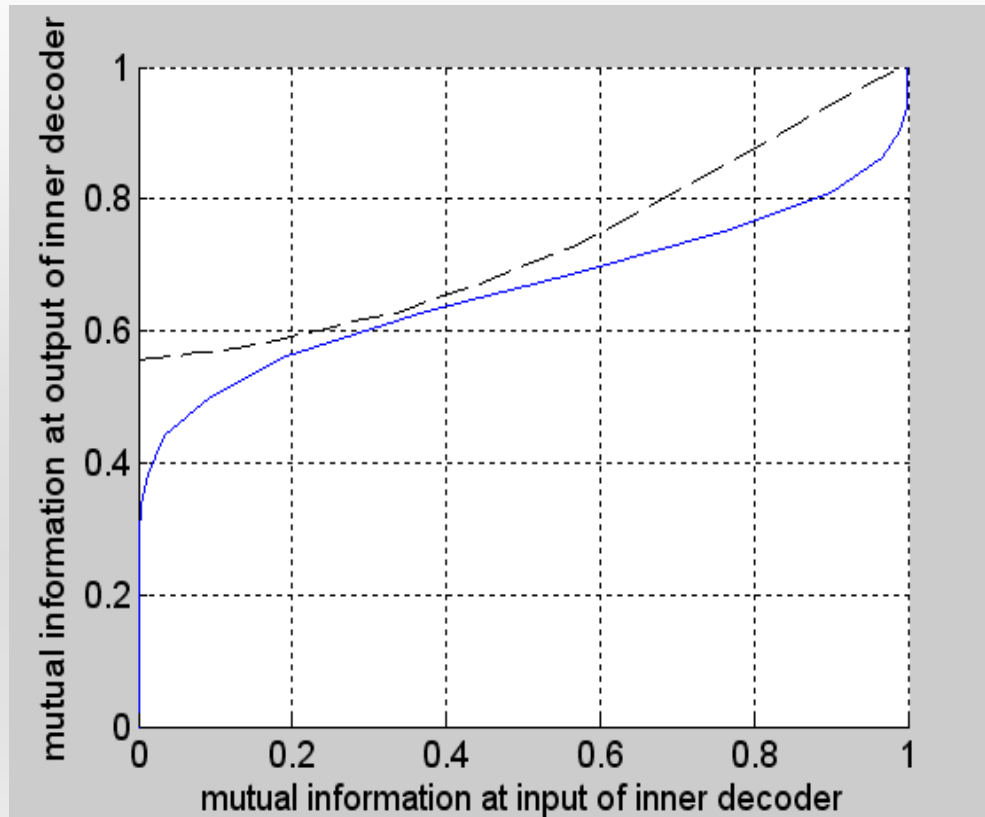
Good performance

- BER floor region



(Stephen ten Brink, “Convergence Behavior of Iteratively Decoded Parallel Concatenated Codes”, IEEE Trans. Comm.Oct.2001)

# How EXIT Charts look like?



**SNR=3dB, outer code rate 0.5 [13,15]**

**SNR=3dB, inner code rate 0.5 [7,5]**

# The invention of EXIT Charts

- The exchange of extrinsic information is visualized as a decoding trajectory in EXIT Charts
- A powerful tool to visualize the convergence behavior of iterative decoding algorithms
- Good performance in low  $E_b/N_0$  & turbo cliff region
- It provides guidance on designing good codes

# How to draw EXIT Charts?

## Ingredients we need:

- Mutual information
- Mutual information Transfer characteristics of iterative decoders
- Combination of transfer characteristics

# Mutual information and Channel capacity

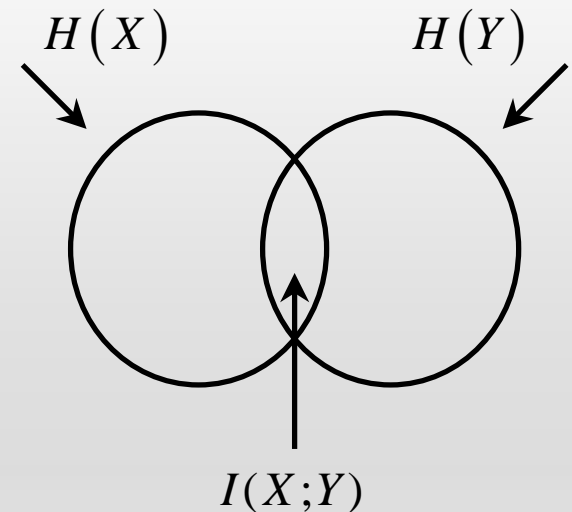
## ➤ Mutual information

$$I(X;Y) = H(Y) - H(Y|X)$$

$$I(X;Y) = \iint f(x,y) \log \frac{f(x,y)}{f(x)f(y)} dx dy$$

where

$$H(Y|X) = \iint f(x,y) \log \frac{1}{f(y|x)} dx dy$$



## ➤ Channel Capacity

$$C = \max_{P_x} I(X;Y)$$

(Claude E. Shannon, "A Mathematical Theory of Communications" 1948)

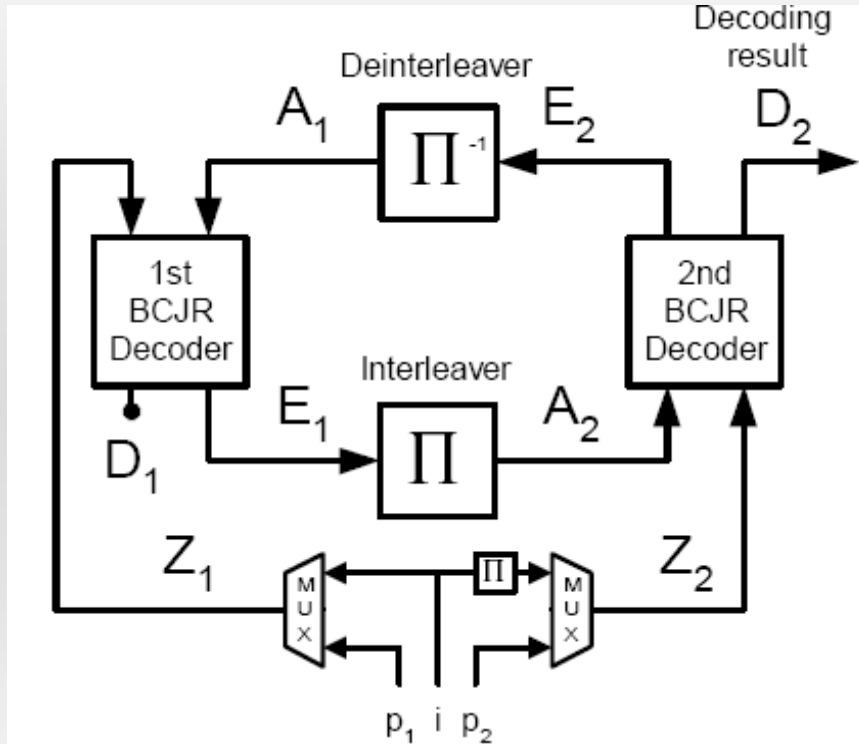
# Why Mutual information as the parameter?

## Benefits of mutual information in EXIT Charts:

- The information-theoretic interpretation
- The value range and logarithmic scaling
- Robustness of the shape
- An interesting fact is the area property



# Iterative decoder used in parallel Concatenated Codes



$$E_1(D_1 - Z_1 - A_1) \rightarrow A_2$$

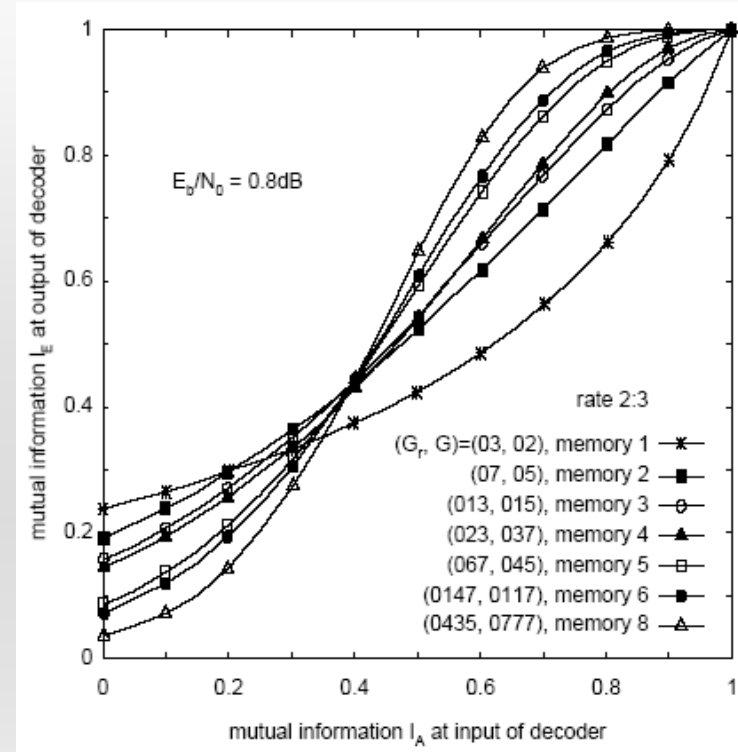
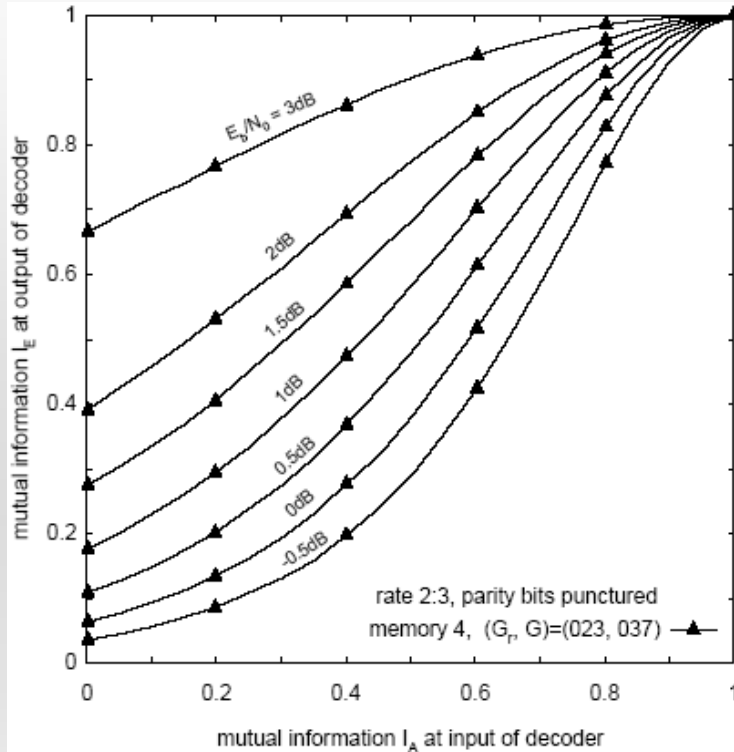
$$E_2(D_2 - Z_2 - A_2) \rightarrow A_1$$

(Stephen ten Brink, "Convergence Behavior of Iteratively Decoded Parallel Concatenated Codes", IEEE Trans. Comm. Oct. 2001)

# Transfer characteristics

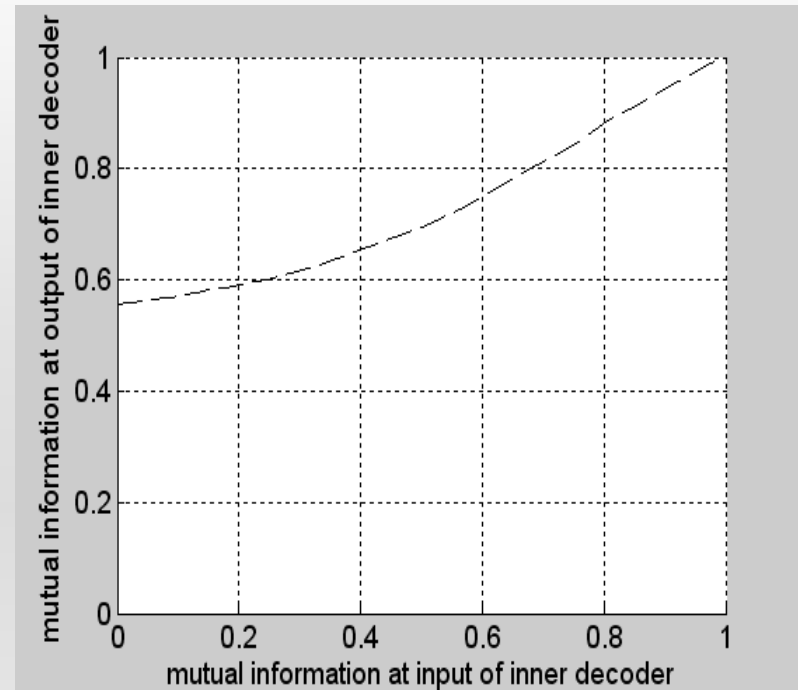
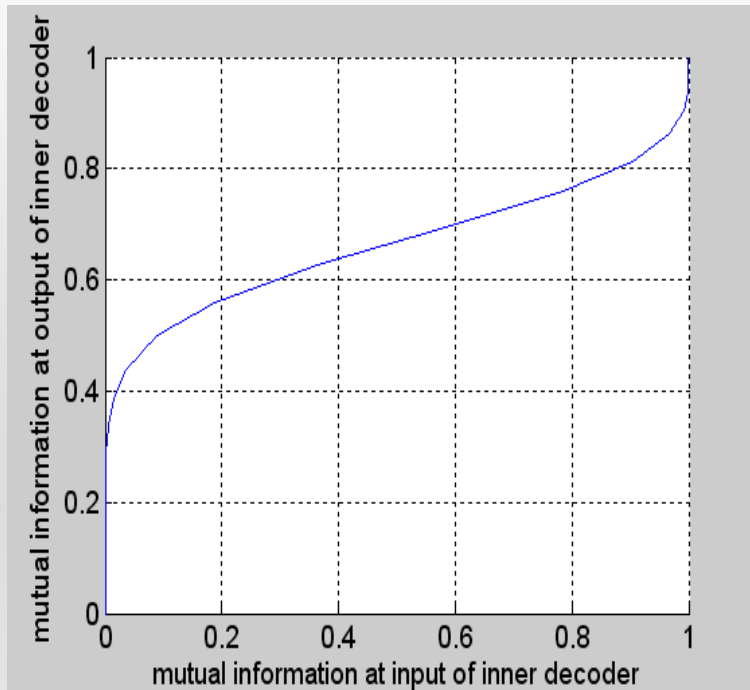
- Iterative decoders exchange message between extrinsic and a priori  $E_1 \rightarrow A_2, E_2 \rightarrow A_1$
- Tracking of messages depends only on mutual information  $I(L_E; X), I(L_A; X)$
- Some parameters, influencing the transfer characteristic curves (number of code memory, depth of interleaving, different code polynomials and  $E_b/N_0$ )

# Transfer characteristics (cont.)



(Stephen ten Brink, “Convergence Behavior of Iteratively Decoded Parallel Concatenated Codes”, IEEE Trans. Comm.Oct.2001)

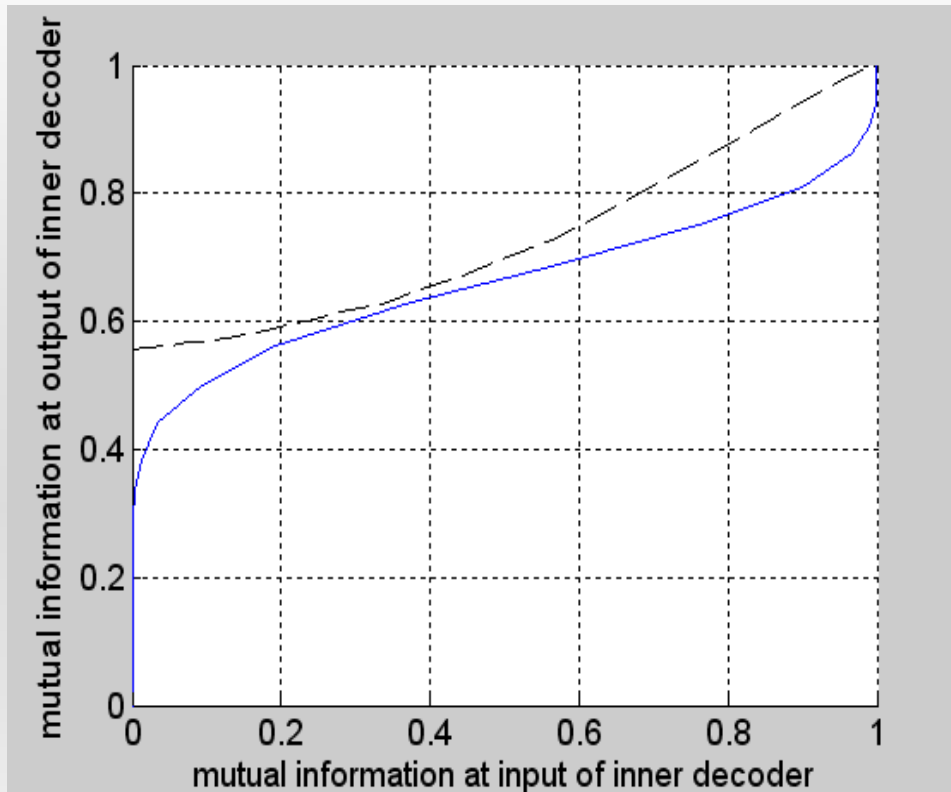
# A Simple Example on Transfer Characteristics



**SNR=3dB, outer code rate 0.5, [13,15]**

**SNR=3dB, inner code rate 0.5, [7,5]**

# Combination of transfer characteristics

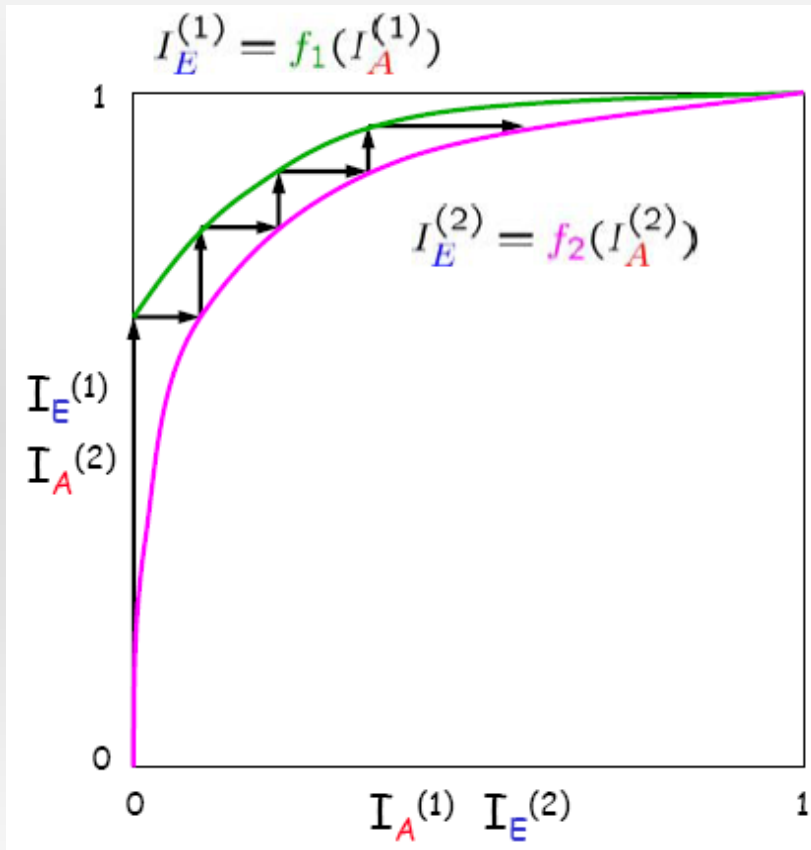


**SNR=3dB,  
outer code  
rate 0.5,  
[13,15],**

**SNR=3dB,  
inner code  
rate 0.5,  
[7,5],**

**Combination of two transfer characteristics engenders EXIT Charts**

# Trajectory of iterative decoding



(J.Sayir, G.Lechner, "Theory and Design of Turbo and Related Codes", ftw. )

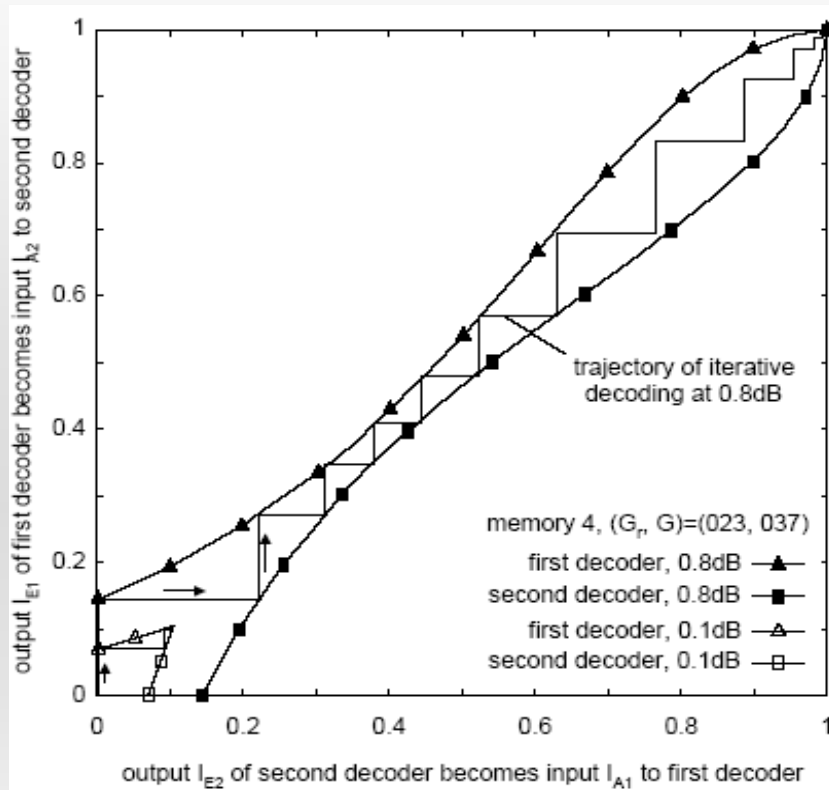
$$I_E^{(1)} = f_1(I_A^{(1)})$$

$$I_E^{(2)} \rightarrow I_A^{(1)}$$

$$I_E^{(2)} = f_2(I_A^{(2)})$$

$$I_E^{(1)} \rightarrow I_A^{(2)}$$

# Exit Charts Features

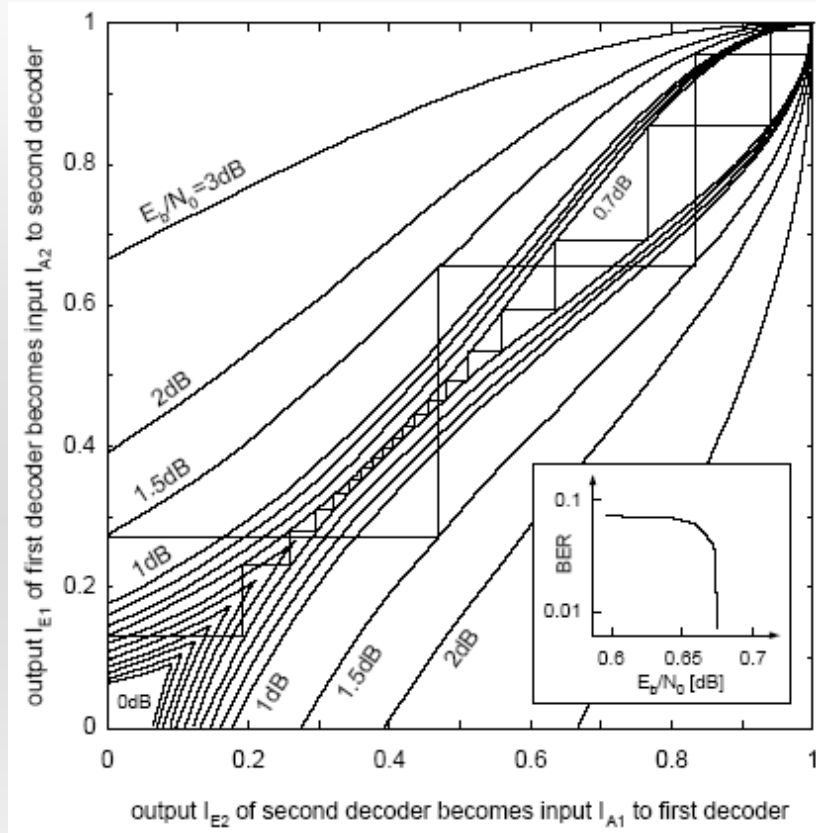


For  $E_b/N_0 = 0.1dB$   
Decoding trajectory  
got stuck early

For  $E_b/N_0 = 0.8dB$   
Decoding trajectory  
just “sneak through  
the bottleneck”

(Stephen ten Brink, “Convergence Behavior of Iteratively Decoded Parallel Concatenated Codes”, IEEE Trans. Comm.Oct.2001)

# Compare EXIT Charts with BER Charts



Pinch-off region,  
trajectory got stuck at  
low mutual information

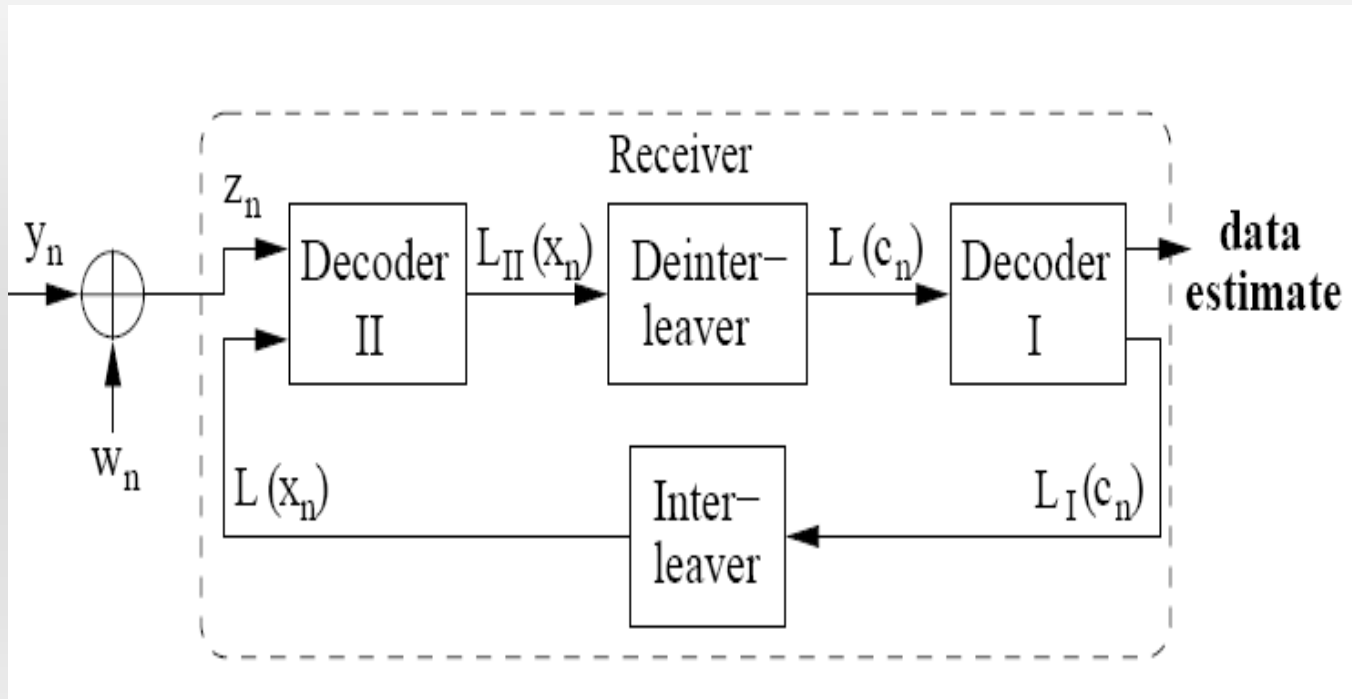
Turbo cliff region is  
bottleneck region with  
slow convergence

BER floor region is the  
wide-open region with  
fast convergence

(Stephen ten Brink, "Convergence Behavior of Iteratively Decoded Parallel Concatenated Codes", IEEE Trans. Comm.Oct.2001)



# Iterative decoder used in serial Concatenated Codes



(J.Hagenauer, "The EXIT Chart- Introduction to Extrinsic Information Transfer in Iterative Processing", EUSIPCO 2004)

# Simplified Calculation of Mutual Information in serial concatenated structure

➤ Two conditions to simplify:

1. Probability density function is Symmetric

$$p(-y|x = +1) = p(y|x = -1)$$

2. Consistency condition

$$p(-y|x) = e^{-L_c xy} p(y|x)$$

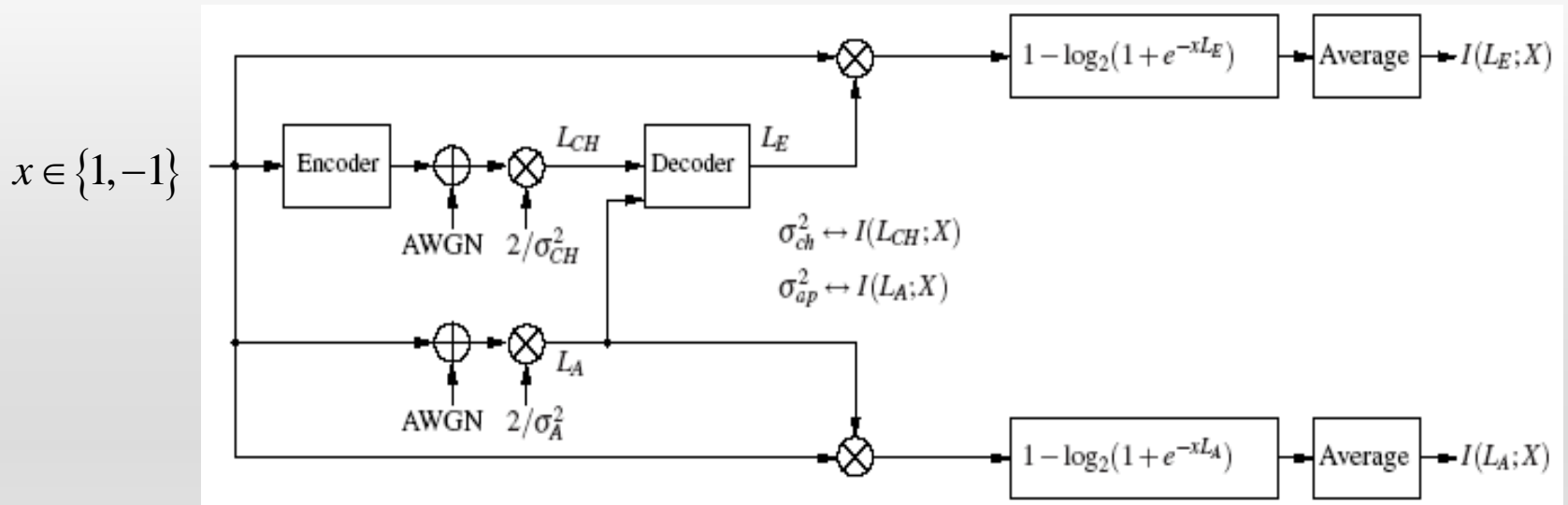
➤ Simplify the calculation of mutual information

$$I(L; X) = 1 - \int_{-\infty}^{+\infty} p(L|x = +1) \log_2(1 + e^{-L}) dL$$

$$= 1 - E\left\{\log_2(1 + e^{-L})\right\}$$

$$p(L|x = +1) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(L - x\sigma^2/2)^2}{2\sigma^2}}$$

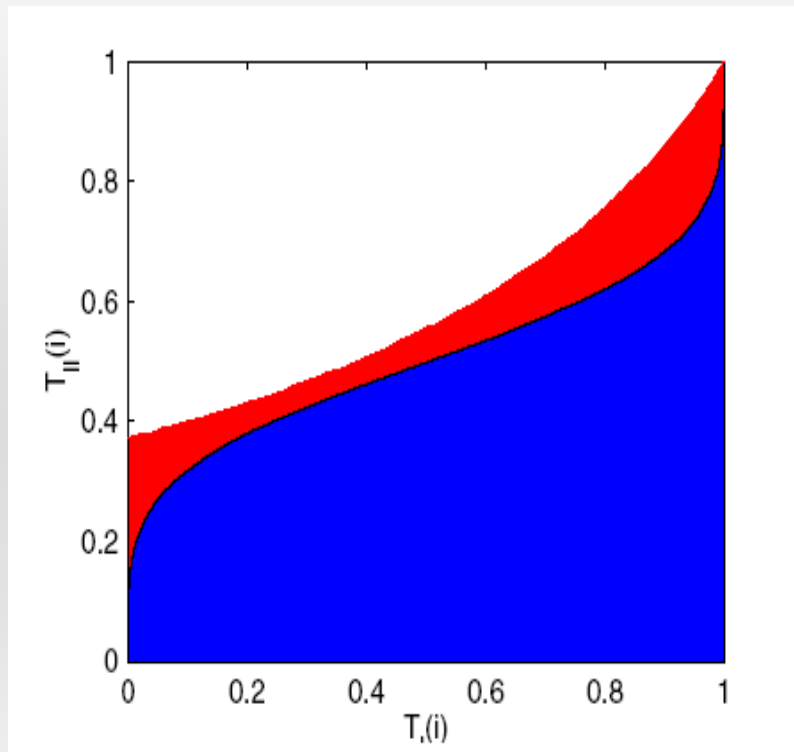
# Measurement of EXIT Charts



Output of lower branch → horizontal axis  
 Output of upper branch → vertical axis

(J.Hagenauer, "The EXIT Chart- Introduction to Extrinsic Information Transfer in Iterative Processing", EUSIPCO 2004)

# Area Property of EXIT Charts



(J.Hagenauer, “The EXIT Chart- Introduction to Extrinsic Information Transfer in Iterative Processing”, EUSIPCO 2004)

Rate- Capacity properties for serial concatenated schemes

$$\int_0^1 T_{II}(i) di \approx C_{ui}$$

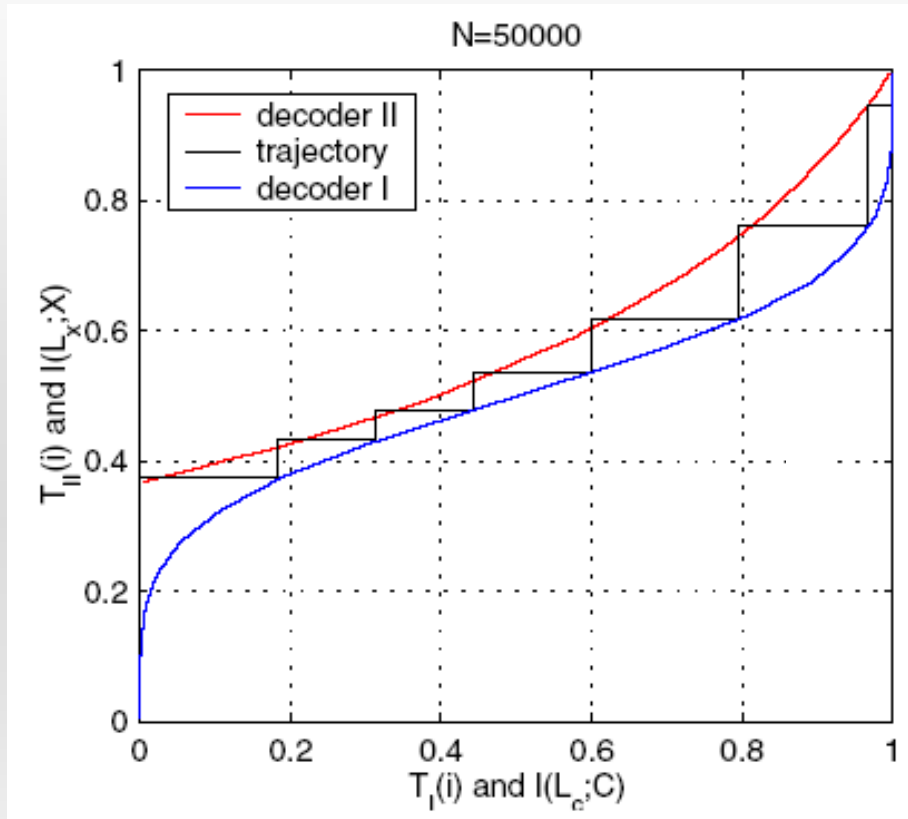
$$\int_0^1 T_I^{-1}(i) di \approx R_I$$

$$\int_0^1 (T_{II}(i) - T_I^{-1}(i)) di > 0 \Rightarrow R_I < C_{ui}$$

Code rate of outer code should be smaller than the capacity of inner channel

Code design is reduced to curve fitting

# Simple example of EXIT Charts



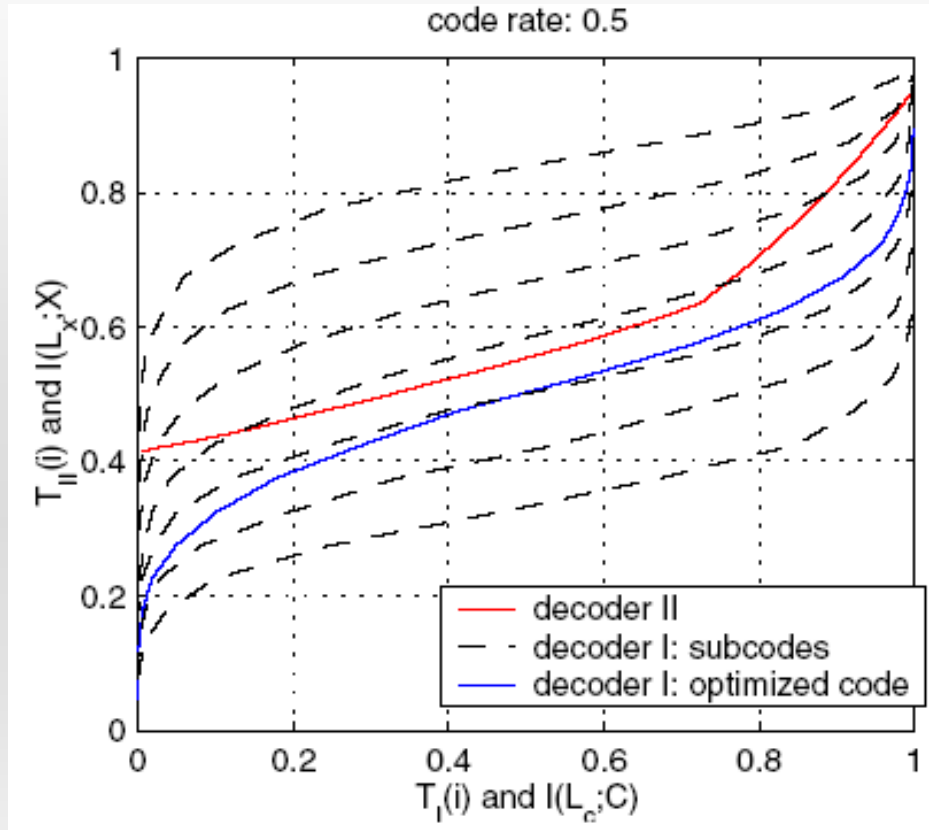
(J.Hagenauer, “The EXIT Chart- Introduction to Extrinsic Information Transfer in Iterative Processing”, EUSIPCO 2004)

## Simple Single Parity Check (SSPC) Codes

Serial concatenation with a DPSK modulator as inner code and an outer code  $M=2$  convolutional code,  $R=1/2$  at  $E_b/N_0=1.5dB$

Trajectory slightly differs from Two EXIT curves due to limited depth of interleaver

# Application of EXIT Charts



**Multipath  
transmission  
as inner code**

**7 convolutional  
code as outer  
codes**

**Irregular codes  
perform good**

(J.Hagenauer, “The EXIT Chart- Introduction to Extrinsic Information Transfer in Iterative Processing”, EUSIPCO 2004)

# Conclusion and Outlook

- **Based on mutual information to visualize the decoding trajectory of iterative decoding**
- **Came out of parallel concatenated structure and can be applied to serial concatenated structure**
- **It gives us some hints on designing good codes**
- **It can be utilized in a variety of fields (Irregular codes, LDPC, etc.)**

**Thank you for your attention!**  
**Questions & Discussions**