

# **Reversible Information Embedding with Compressed Host at the Decoder**

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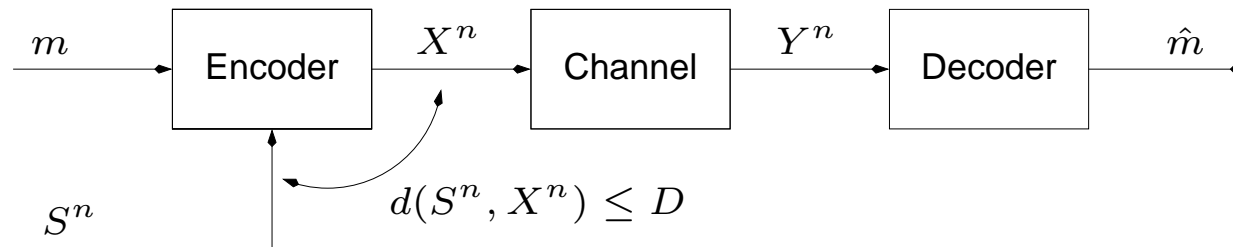
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# Outline

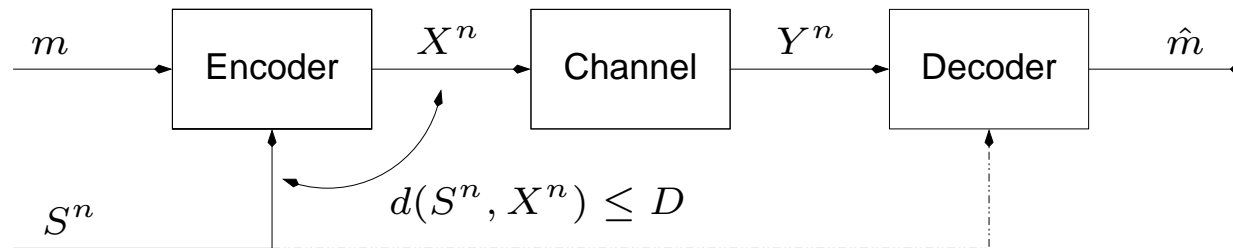
- ▶ The general Information Embedding problem
  - ▶ Public vs. private
  - ▶ The distortion constraint
- ▶ Reversible Information Embedding
- ▶ Previous work
- ▶ Compressed host @ decoder(s)
- ▶ Main result
- ▶ Extensions and future work

# The Information Embedding (IE) Problem



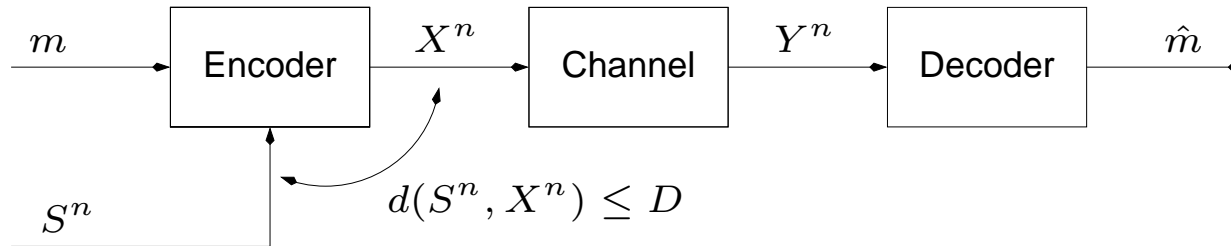
- ▶ A message  $m$  is embedded into host signal  $S^n$ , producing data set  $X^n$
- ▶  $X^n$  is transmitted via  $P_{Y|X}$  to its destination
- ▶ At the destination, a noisy version  $Y^n$  of the data set is received, from which  $m$  is decoded.
- ▶ In IE,  $m$  is embedded into  $S^n$  in a manner that is transparent to the unintended observer  $\Rightarrow$  a distortion constraint between  $S^n$  and  $X^n$
- ▶ **Public IE** – The host  $S^n$  is known only at the decoder

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- ▶ **Public IE** – The host  $S^n$  is available only at the encoder
- ▶ **Private IE** – The host  $S^n$  is available at both, encoder and decoder

## The IE Problem (cont'd)



The distortion constraint is imposed in order to:

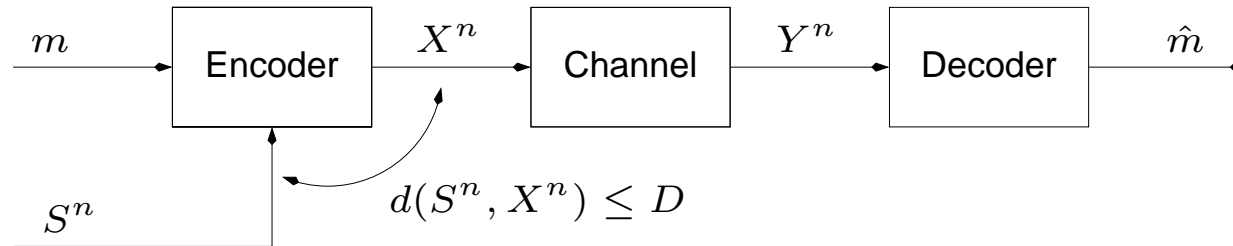
- ▶ Hide the fact that communication (beyond that of  $S^n$ ) is taking place
- ▶ Reduce total distortion at the output

Classical IE puts emphasis on embedding rate vs. input distortion  $D$ .

Closely related to Gel'fand & Pinsker channel [Moulin & O'Sullivan, 2003], via the constraint. Thus

$$C = \max_{\mathbb{E}d(S, X) \leq D} [I(U; Y) - I(U; S)]$$

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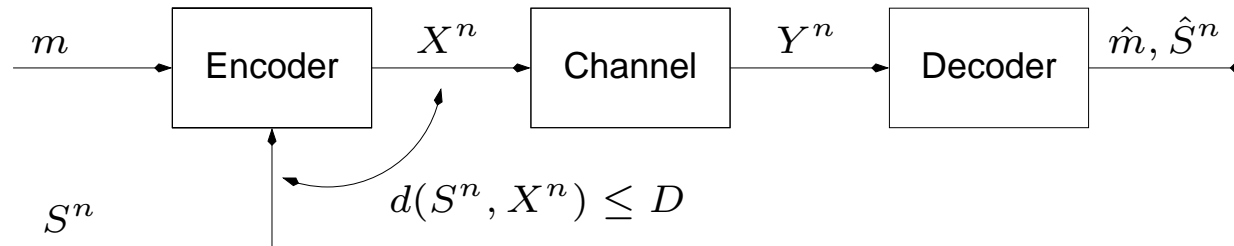
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But: Some applications cannot tolerate distortion at the destination (e.g., medical imagery).

# Reversible IE

[Fridrich, Goljan, Du *SPIE* 2002], [Kalker & Willems, 2002]

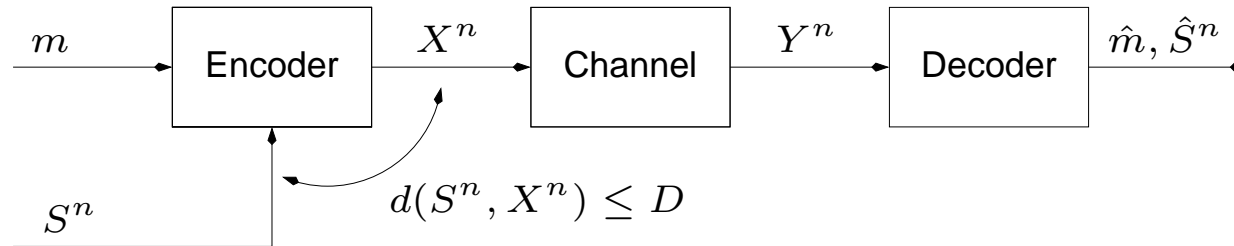


In reversible IE (RIE), an additional constraint is imposed, that  $S^n$  can be faithfully restored from  $Y^n$ . The constraint  $\mathbb{E}d(S, X) \leq D$  is still relevant

$$C = \max H(X) - H(S) \quad (\text{no attack channel, Kalker \& Willems})$$

$$C = \max I(X; Y) - H(S) \quad (\text{with channel, Kotagiri \& Laneman '05})$$

## Reversible IE (cont'd)



$$C = \max_{\mathbb{E}d(S, X) \leq D} I(X; Y) - H(S)$$

High cost is paid due to the requirement to reproduce the host.

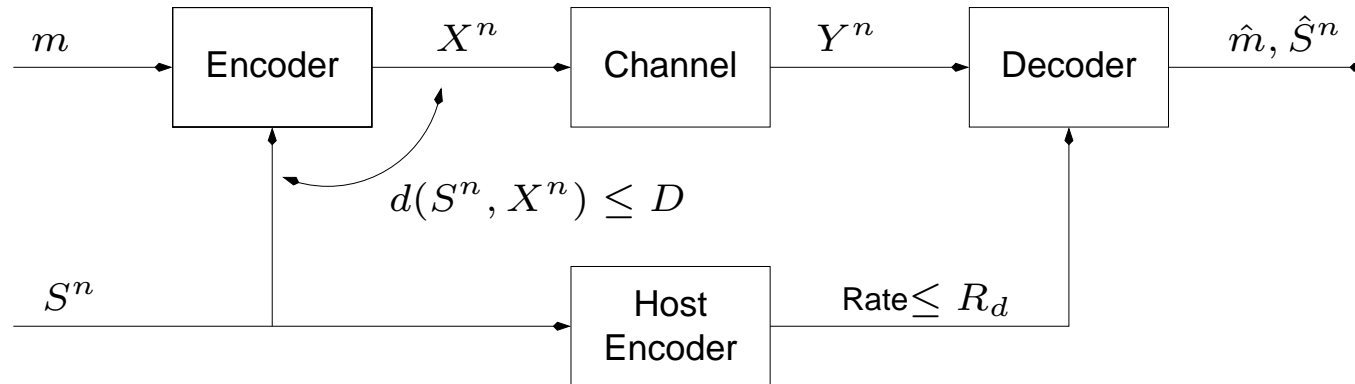
Possible solution – provide the decoder, a priori, with side information on  $S^n$ :

- ▶ Independent of the embedded messages
- ▶ Available before communication (embedding) begins
- ▶ Rate limited.

⇒ Reversible information embedding with compressed host at the decoder (RIEC)



## RIEC - Problem formulation



### Problem:

Characterize the region of all achievable  $(R, R_d, D)$ , where:

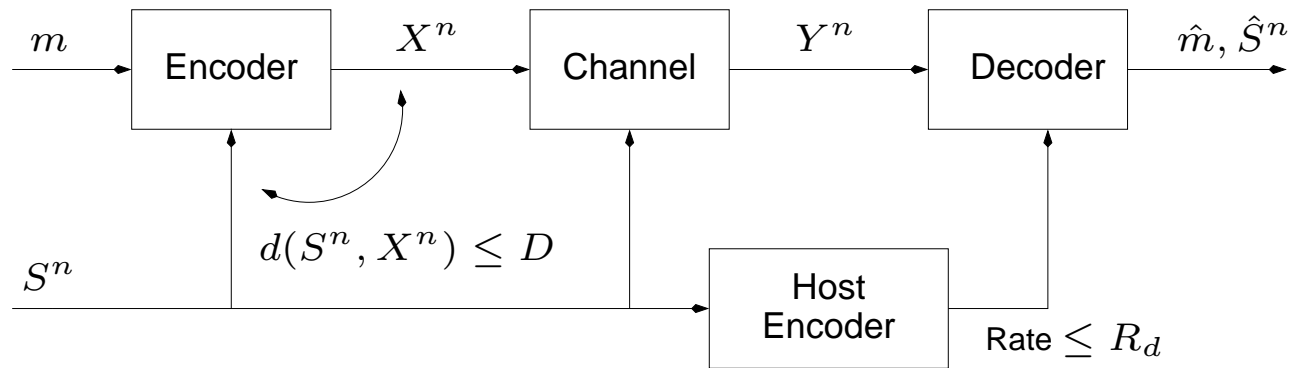
$R$  – Embedding rate,

$R_d$  – rate of compressed SI @ decoder

$D$  – distortion between host and input

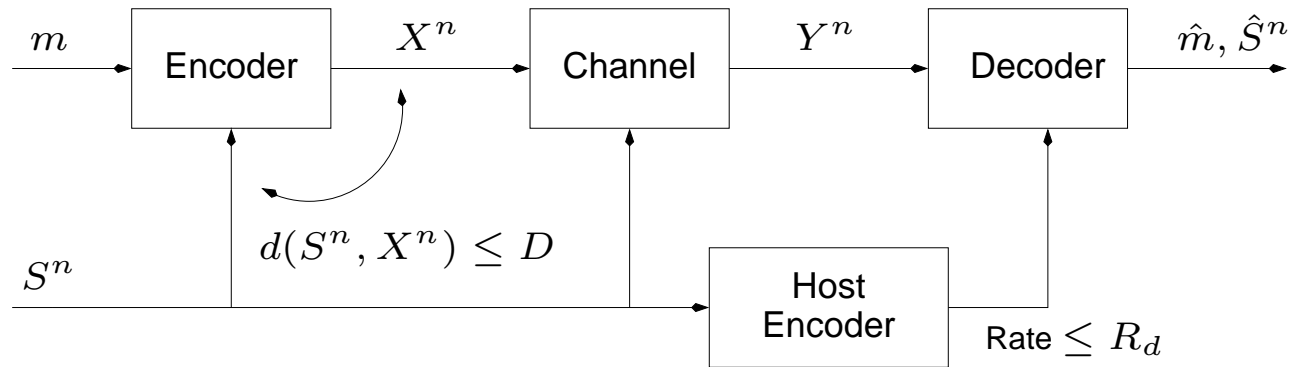
under the requirement of complete reconstruction of the host at the decoder.

## Related problems



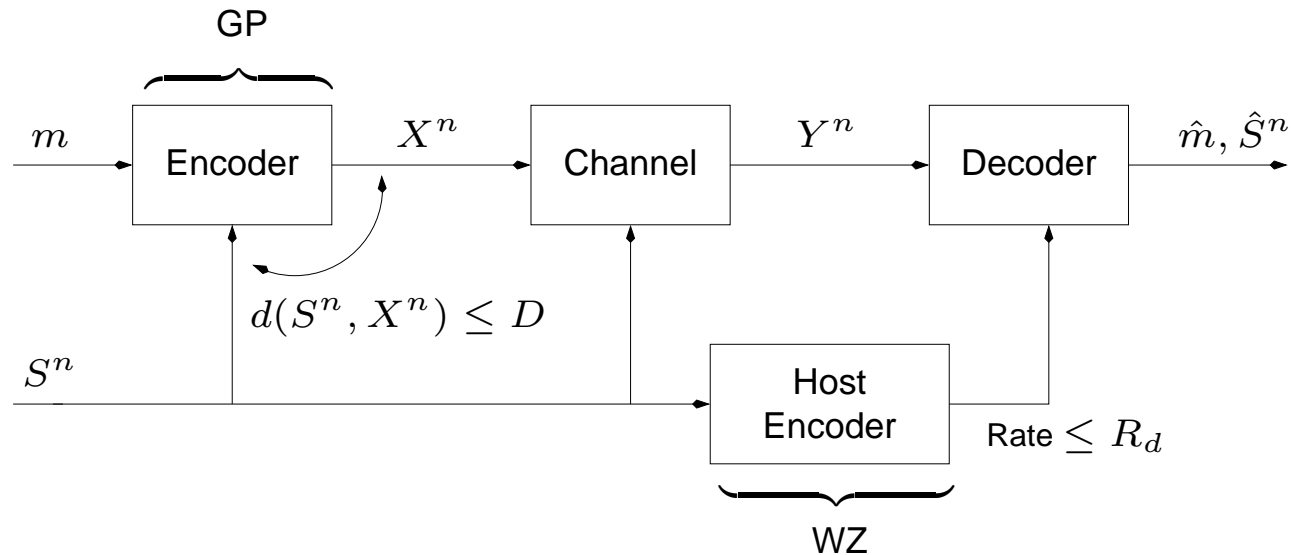
As the IE problem is closely related to the GP problem we let the channel depend on  $S$ .

## Related problems



- ▶  $S^n$  is known noncausally at the encoder  $\Rightarrow$  channel coding part is related to the Gel'fand-Pinsker (GP) problem.
- ▶  $Y^n$  depends statistically on  $S^n$  and can serve as side information (SI) in retrieving the compressed state at the decoder  $\Rightarrow$  coding of  $S^n$  is related to the Wyner-Ziv (WZ) problem.

## Related problems (cont'd)



- ▶ For the WZ problem, the SI  $Y^n$  is not memoryless
- ▶ There is no distortion constraint in retrieving  $S^n$  at the decoder (instead, maximize capacity of the main channel)

## *Previous work*

1. Wyner & Ziv, 1976
2. Gel'fand & Pinsker, 1980
3. Fridich, Goljan, & Du 2002. Kalker & Willems 2002.
4. Kotagiri & Laneman, 2005 – RIE in multiuser channels.
5. Heegard & El Gamal, 1983, "On the capacity of computer memory with defects." Introduced coding for state dependent channels with rate limited side information at both ends. Devised an achievable region.
6. Steinberg 2006 – Coding with rate limited SI.

The current model is a combination of 4 and 6.

## Main result

$\mathcal{R}^*$  – collection of all  $(R, R_d, D)$  satisfying

$$\begin{aligned} R &\leq I(X, S; Y | S_d) - H(S | S_d) \\ R_d &\geq I(S; S_d) - I(Y; S_d) \\ D &\geq \mathbb{E}(S, X) \end{aligned}$$

for some  $S_d$  such that  $S_d \ominus (S, X) \ominus Y$ . Then

**Theorem:** For any discrete memoryless (state-dependent) attack channel, with full noncausal SI at the transmitter, and rate-limited SI at the receiver, a triple  $(R, R_d, \Gamma)$  is achievable with perfect reconstruction of  $S^n$  at the decoder, if and only if  $(R, R_d, \Gamma) \in \mathcal{R}^*$ .

## Main result (cont'd)

$\mathcal{R}^*$  – collection of all  $(R, R_d, D)$  satisfying

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for some  $S_d$  such that  $S_d \oplus (S, X) \oplus Y$ .

- ▶  $\mathcal{R}^*$  is convex
- ▶  $S_d$  – A WZ rv, represents the compressed state  $S^n$ . Fully decoded, with  $Y^n$  as SI.

## Main result (cont'd)

$\mathcal{R}^*$  – collection of all  $(R, R_d, D)$  satisfying

$$\begin{aligned} R &\leq I(X, S; Y | S_d) - H(S | S_d) \\ R_d &\geq I(S; S_d) - I(Y; S_d) \quad (*) \\ D &\geq \mathbb{E}d(S, X) \end{aligned}$$

for some  $S_d$  such that  $S_d \ominus (S, X) \ominus Y$ .

- ▶  $S_d \ominus (S, X) \ominus Y$  does not imply  $S_d \ominus S \ominus Y$ . Therefore  $(*)$  is not equivalent to

$$R_d \geq I(S; S_d | Y),$$

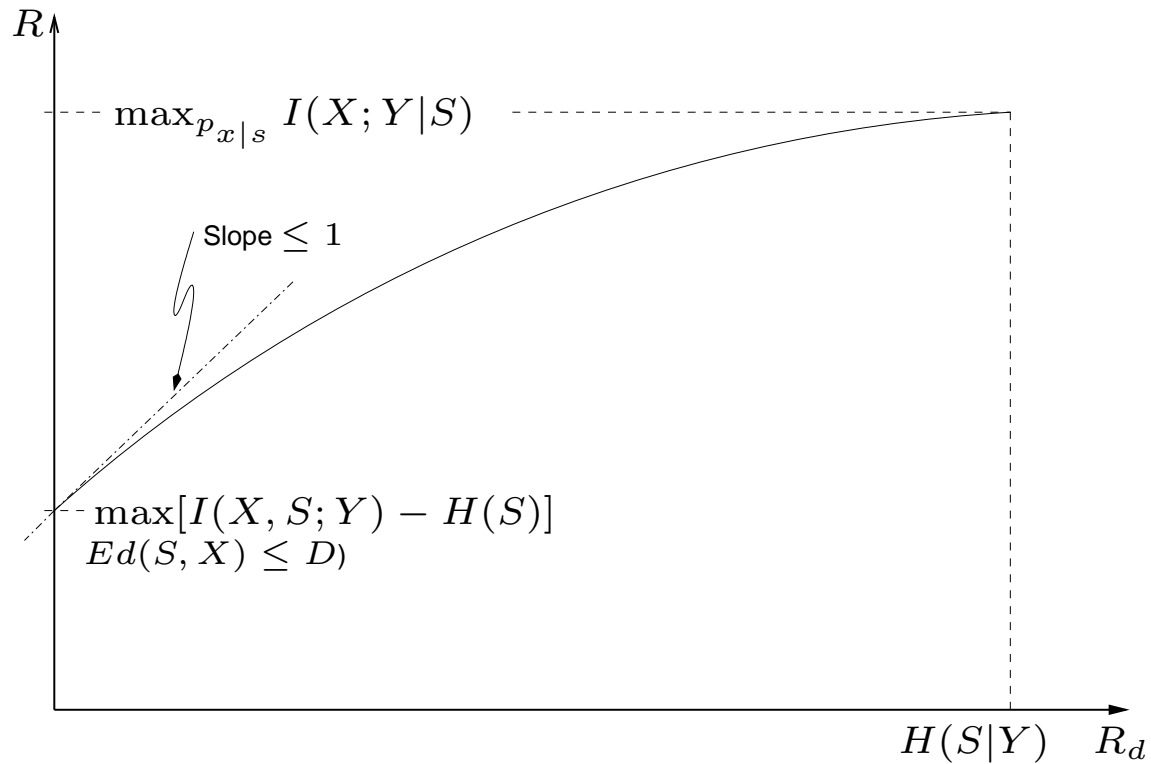
full duality with GP.

- ▶ In classical WZ,  $S_d \ominus S \ominus Y$  is needed to guarantee joint typicality of  $S_d$  and  $Y$ . Here it is guaranteed due to the channel.



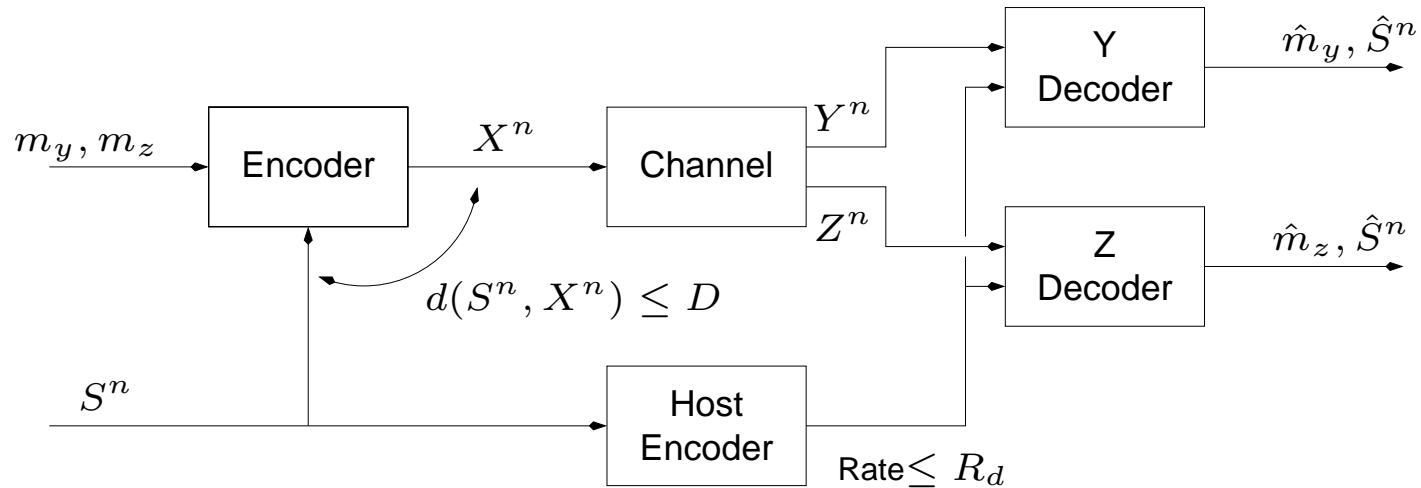
## A typical $(R, R_d)$ curve

A typical  $(R, R_d)$  curve, for fixed  $D$ :



- ▶ The rate allocated to provide the decoder with compressed host (SI), is always **at least as high** as the gain in the embedding rate.
- ▶ Provide SI to the decoder when the wayside channel cannot be used to transmit embedded data – e.g.
  - ▶ Remotely located physical channel
  - ▶ IE systems where a compressed host is kept in memory at the decoder, for **future** use.

## RIEC with several stages of attack



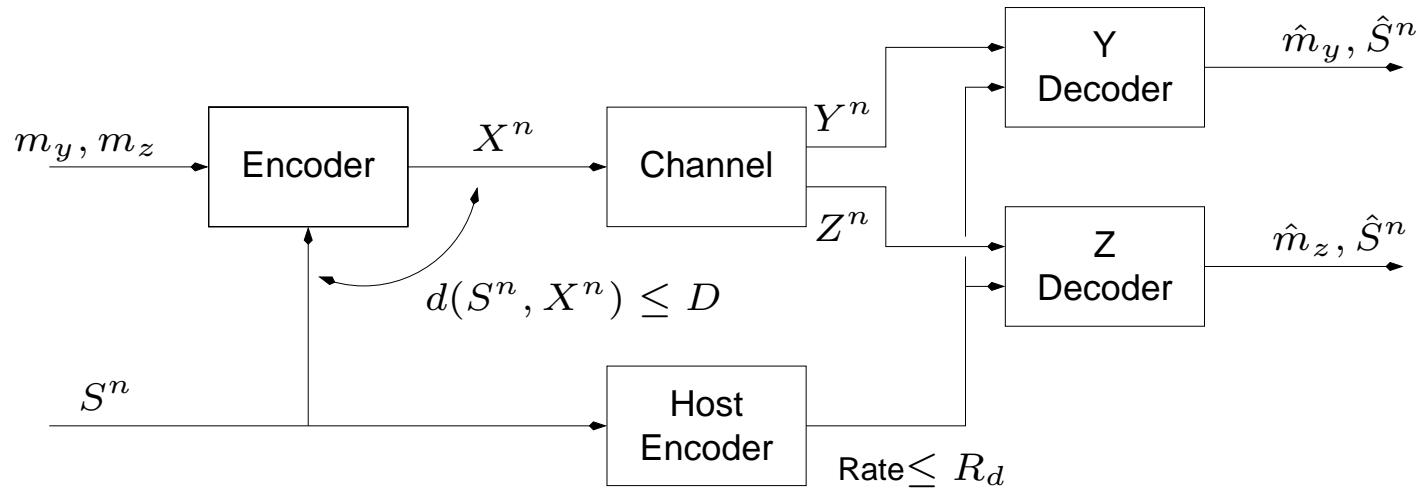
Extension of the Kotagiri & Laneman model.

Assume a degraded broadcast channel:

$$P_{Y,Z|X,S} = P_{Y|X,S}P_{Z|Y},$$

a good model for several stages of attack.

## RIEC with several stages of attack



The region of all achievable  $(R_y, R_z, R_d, D)$  is given by the set of all quadruples satisfying

$$\begin{aligned}
 R_y &\leq I(X; Y | U, S_d, S) \\
 R_z &\leq I(U, S; Z | S_d) - H(S | S_d) \\
 R_d &\geq I(S_d; S) - I(S_d; Z) \\
 D &\geq \mathbb{E}d(S, X)
 \end{aligned}$$

for some  $(U, S_d) \ominus (X, S) \ominus (Y, Z)$ .

## *Future work*

- ▶ Extensions to other network models
  - ▶ MAC
  - ▶ Ad hoc networks. Part of the users are silent, and can transmit SI at low cost.
- ▶ Specific models. Coding schemes.
- ▶ Computational algorithms.