

# Optimizing Joint Erasure- and Error-Correction Coding for Wireless Packet Transmissions

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# Motivation

- Often data has to be transmitted through a series of wireless and wired links
- Performance bottleneck is then the wireless link
  - Unreliable due to fading
  - Less bandwidth
  - Subject to interference
- Powerful and efficient coding possible across the whole data block
- Individual packets are subject to fading when traveling across the wireless link
  - Outage corrupts complete packet, otherwise negligible error rate
  - Not efficient to forward corrupted packets
- Use error-correction coding per packet -> *view as an erasure channel*

# Digital Fountain Codes

- Efficient erasure-correction codes now available
  - Digital Fountain principle - generate practically endless streams of encoded packets
  - Reception of a sufficient number of correct packets leads to high decoding probability
  - Small overhead (about 5% for reasonable size)

M. Luby, “LT Codes,” in *Proc. 43<sup>rd</sup> Annual IEEE Symposium on Foundations of Computer Science*, Nov. 2002

M. Shokrollahi, “Raptor Codes,” *IEEE Trans. Inform. Theory*

# System Model – Assumptions

- End-to-end transport of a finite-size data block
  - Performance is dominated by a wireless link
  - Wireless link is well characterized by block fading model

$$y = hs + w$$

- Average signal-to-noise ratio on wireless link

$$\gamma = E [|s|^2] / E [|w|^2]$$

- Large feed-back delay
  - Usage of automatic repeat request (ARQ) not possible

# System Model – Layered Coding

- Layered coding approach
  - Erasure-correction coding across the data packets
  - Error-correction coding per packet on the physical layer

- Erasure-correction coding

- Block of  $N_{\text{data}}$  bits is partitioned into  $k$  packets
- Generate  $K$  encoded packets with rate  $r_n$

$$N_{\text{data}} = kN_b$$

$$r_n = \frac{k}{K}$$

- Error-correction coding

- Each packet of  $N_s$  symbols carries  $N_b$  bits
- Define coding rate as non-vanishing fraction of ergodic Capacity  $C$

$$R_{\text{phy}} = \frac{N_b}{N_s}$$

$$r_p = \frac{R_{\text{phy}}}{C}$$

# System Model – Nakagami Model

## Capacity on Nakagami- $m$ block fading channel

- Mutual information assuming Capacity achieving Gaussian codebooks

$$I = \log_2 (1 + \gamma |h|^2)$$

- Ergodic capacity defined as average mutual information

$$C(\gamma, m) = E [\log_2(1 + \gamma |h|^2)] = \log_2(e) e^{m/\gamma} \sum_{k=0}^{m-1} \left(\frac{m}{\gamma}\right)^k \Gamma\left(-k, \frac{m}{\gamma}\right)$$

- Correct physical layer decoding is achieved, if mutual information is above transmission rate

$$\begin{aligned} p &= \Pr(I < R_{\text{phy}}) \\ &= \Pr(|h|^2 < \alpha = (2^{R_{\text{phy}}} - 1) / \gamma) \\ &= 1 - \sum_{k=0}^{m-1} \frac{1}{k!} (m\alpha)^k e^{-m\alpha} \end{aligned}$$

# System Model – Performance

- Total outage probability of transmission
  - Depends on number of correctly received packets  $k' > k$
  - Packet error detection based on CRC is perfect

$$P_{\text{outage}} = \sum_{i=0}^{k'-1} \binom{K}{i} (1-p)^i \cdot p^{K-i}$$

- Define efficiency of data transfer

$$\eta = \frac{N_{\text{data}}}{KN_sC} = \frac{k}{K} \cdot \frac{N_b}{N_sC} = r_n \cdot r_p$$

# Problem Statement

- Obvious trade-off necessary between  $r_p$  and  $r_n$ 
  - Smaller physical rate leads to less corrupted packets
  - Low network rate reduces vulnerability to packet loss
  
- Investigate two dual problems:
  1. Optimizing Performance under Resource Const.
    - Fix overall efficiency
    - Split resources between coding layers
  2. Minimizing Resource under Performance Const.
    - Adhere to prescribed outage probability
    - Combine strengths of coding layers



# Optimal Combining of Inter- and Intra-Packet Coding



## □ Preliminaries

- For large  $k'$  and  $K$  approximate  $P_{\text{outage}}$  as Gaussian

$$P_{\text{outage}} \approx Q \left( \frac{Kq - k'}{\sqrt{Kpq}} \right)$$

- Probability of correct transmission  $q$

$$q = 1 - p$$

- Define a constant  $\rho$

$$\rho = k'/k$$

- Portion of variable redundancy in  $r_n$

$$\tilde{r}_n = \frac{k'}{K} = \rho r_n$$

- Simplify  $P_{\text{outage}}$  using the definitions

$$P_{\text{outage}} = Q \left( \sqrt{\frac{\rho N}{N_s C}} \frac{q - \tilde{r}_n}{\sqrt{\tilde{r}_n r_p p q}} \right)$$

# Optimal Combining of Inter- and Intra-Packet Coding – Solution 1.



- Optimizing performance under resource constraint
  - Use equivalent obj. function

$$\max J(r_p, \tilde{r}_n) := \frac{q - \tilde{r}_n}{\sqrt{r_p \tilde{r}_n (1 - q) q}}$$

subject to  $r_p \tilde{r}_n \geq \tilde{\eta}_0$

- The Lagrange approach leads to:

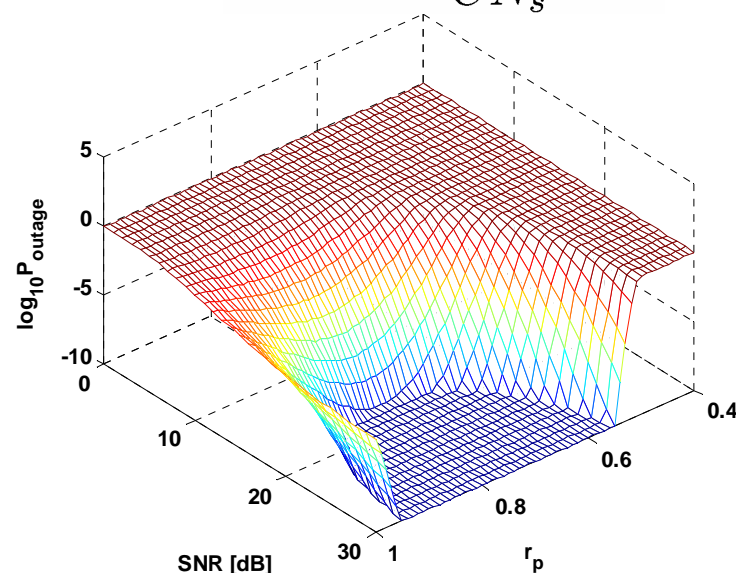
$$\tilde{r}_n = \frac{-r_p q \dot{q}}{2q(1 - q) - r_p(2q - 1)\dot{q}} \quad \dot{q} = \frac{\partial q}{\partial r_p}$$

- Solution is intersection with constraint

- Numerical Example

- $P_{\text{outage}} = 1$  for  $r_p < 0.5$
- Clear minimum for average SNR around  $r_p = 0.8$

$$\tilde{\eta}_0 = 0.5 \quad \frac{\rho N}{CN_s} = 2^8$$

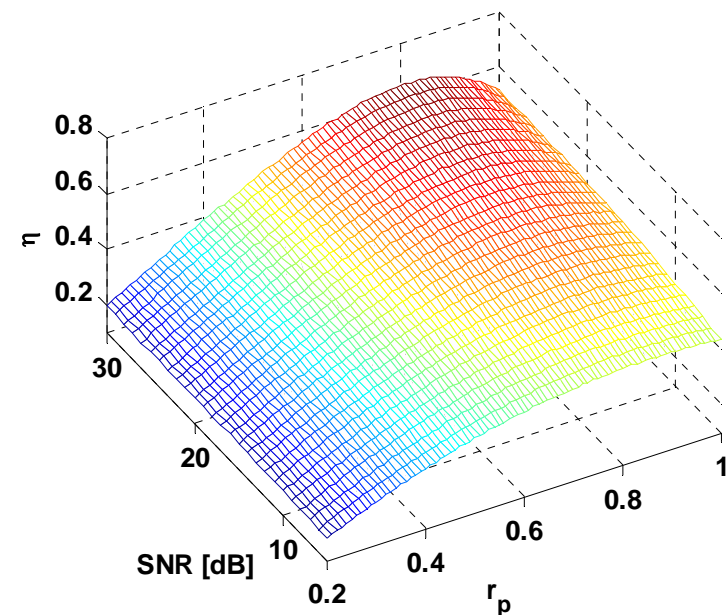


# Optimal Combining of Inter- and Intra-Packet Coding – Solution 2.

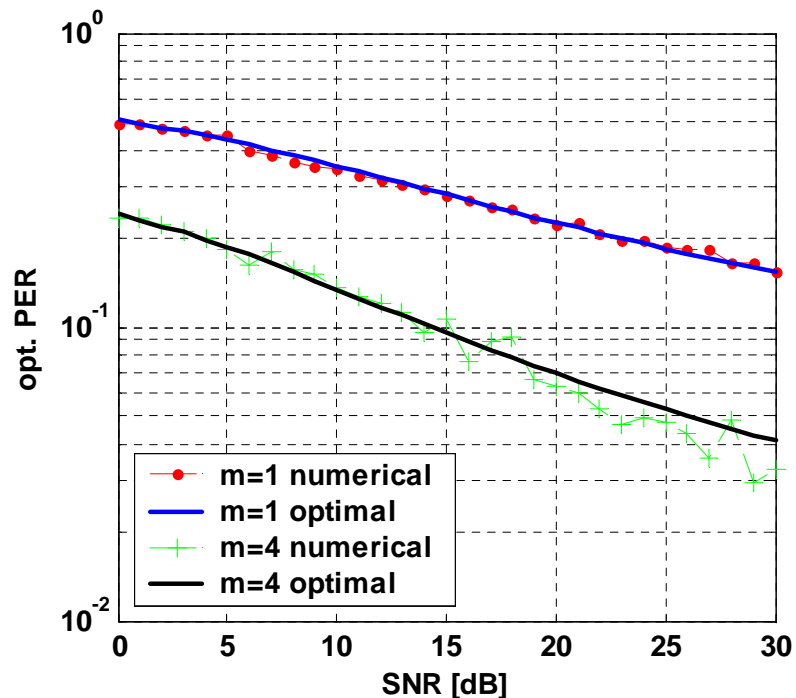
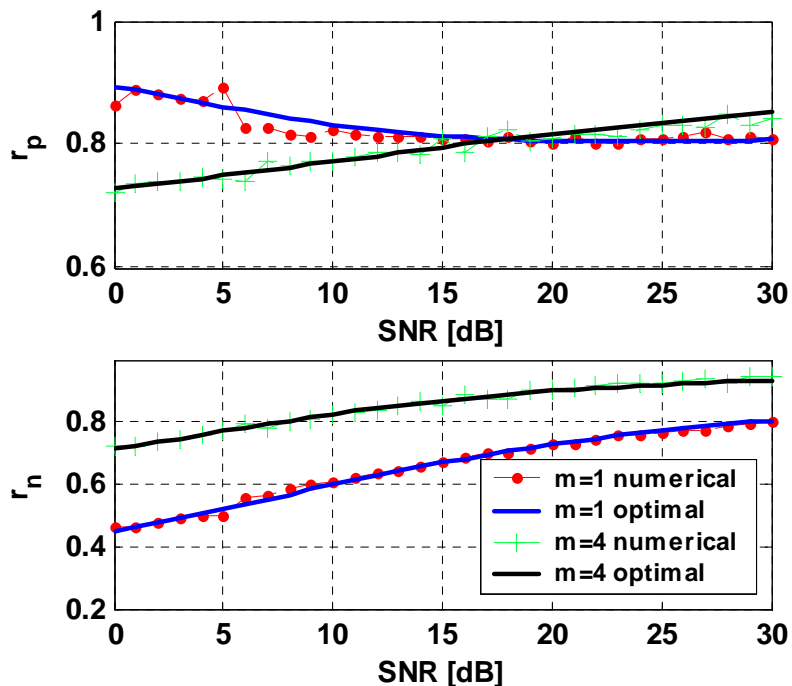


- Minimizing efficiency under performance constraint
  - Constraint and objective exchanged: dual problem
  - Intersect with performance constraint instead
  
- Numerical Example
  - Plot looks concave with global maximum for all SNR

$$P_{\text{outage}} = 10^{-2} \quad \frac{\rho N}{CN_s} = 2^8$$



# Optimal Combining of Inter- and Intra-Packet Coding – Numerical Example (cont.)



- Optimal rates for Rayleigh and Nakagami-4 fading channel
- Rayleigh has distinctly different behavior

- Comparison of packet error rates
- Rayleigh PER is above  $10^{-1}$  while Nakagami-4 is much lower

# Rate Optimization in a Special Case

- Consider an infinite data stream
  - Outage probability goes to zero

$$\lim_{N_{\text{data}} \rightarrow \infty} Q \left( \sqrt{\frac{\rho N_{\text{data}}}{N_s C}} \frac{q - \tilde{r}_n}{\sqrt{\tilde{r}_n r_p q (1 - q)}} \right) = 0$$

- If erasure coding rate is below success  $r_n < q$
  
- This leads to a simpler optimization problem
  - Outage problem is zero
  - Erasure coding replaces lost packages

$$\max \eta = \max_{r_p} r_p q$$

# Rate Optimization in a Special Case

## Result I



- On a Rayleigh fading channel, the physical rate maximizing  $\eta = r_p q$  is given by:

$$r_p = \frac{W(\gamma)}{\ln(2)C}$$

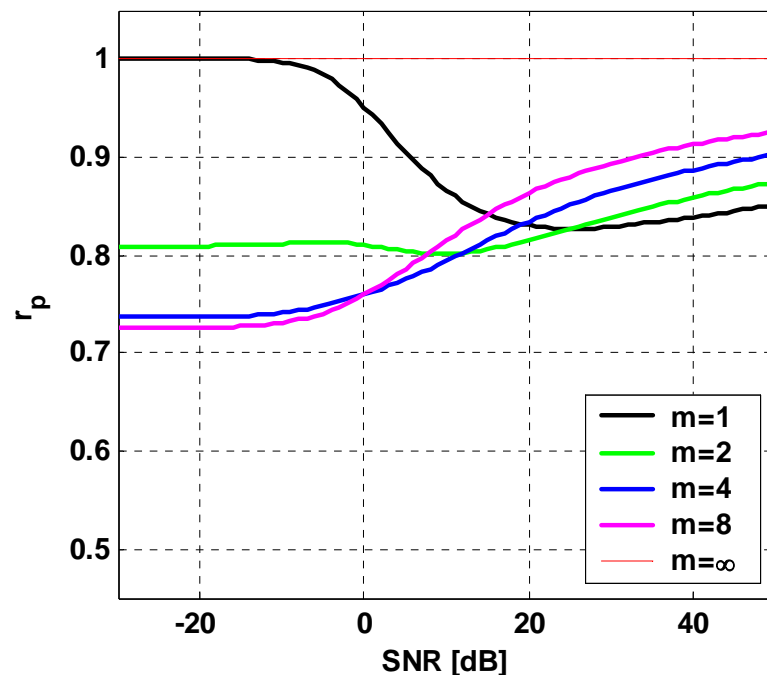
With the Lambert-w function  $W(\gamma)$

- This leads to a network rate as:

$$\tilde{r}_n = \exp \left[ -\frac{1}{W(\gamma)} + \frac{1}{\gamma} \right]$$

- At high SNR, we have:

$$\lim_{\gamma \rightarrow \infty} r_p = 1, \quad \lim_{\gamma \rightarrow \infty} \tilde{r}_n = 1$$



- Using Results I and numerical optimization we plot  $r_p$
- Rayleigh shows distinctly different behavior for  $m > 2$

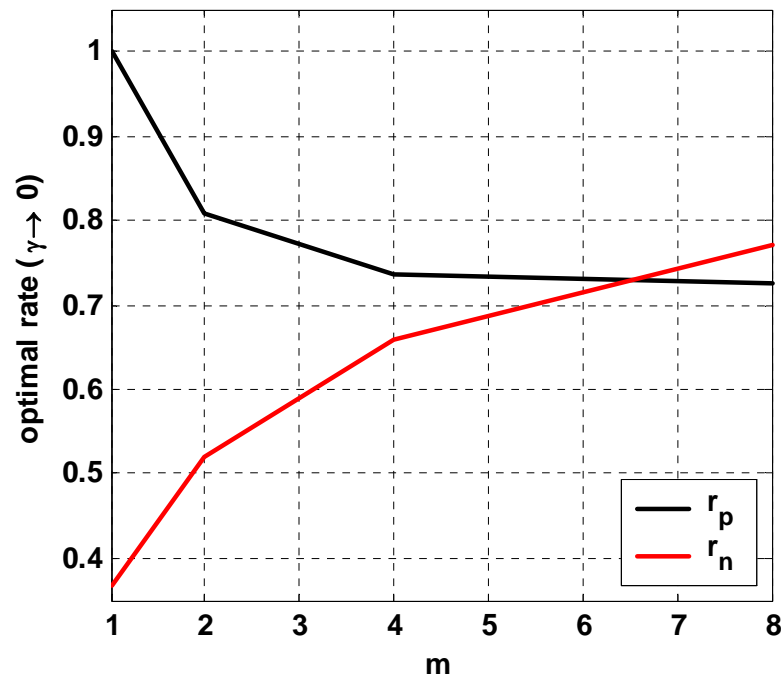
# Rate Optimization in a Special Case

## Result II



- For general Nakagami- $m$  fading channels, the optimal rates maximizing  $\eta = r_p q$  at vanishing SNR are constant

	$r_p$	$r_n$
$m = 1$	1	$e^{-1} \approx 0.368$
$m = 2$	0.809	0.519
$m = 3$	0.757	0.660
$m = 4$	0.736	0.729



- Layered coding approach leads to practical and efficient transmission scheme
  
- A well-defined tradeoff exists, optimally allocating resources to both coding levels
  - On severe fading channels, tendency is to use more erasure coding
  - Investing in physical layer coding has worse payoff
  
- For infinite data streams, closed form solutions show specific behavior for severe fading channels