# Capacity of 1-to-K Broadcast Packet Erasure Channels with Channel Output Feedback - A Packet Evolution Approach 

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Joint work with Y. Charlie Hu (Purdue), Ness B. Shroff (The OSU), Dimitrios Koutsonikolas, Abdallah Khreishah.

## Two Ingredients

- Packet Erasure Channels (PECs):
- Input: $X \in \operatorname{GF}\left(2^{b}\right)$ for large $b$.

- A packet $X$ either arrives perfectly (with the help of CRC), or is considered as erasure and discarded. (No hybrid ARQ).
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- Create its own SI through spatial diversity.

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- Empirically, 10-20\% throughput improvement.
- Our goal: Finding the Shannon capacity of PECs with channel output feedback (COF) for arbitrary number $M \geq 3$ of sessions.


## Main Results \& Contents

- The benefits of ER follows from the channel output feedback (COF).


| \# of sessions | ER-like Protocols <br> (Broadcast PECs <br> w. COF) | Gaussian broadcast <br> channels w. COF |
| :--- | :---: | :---: |
| $\mathrm{M}=2$ | Full capacity region <br> [Georgiadis et al. <br> 09] | Outer and inner <br> bounds [Ozarow 84] |
| $\mathrm{M}=3$ | Full capacity region | $?$ |
| General M | (1) Capacity for fair <br> systems; <br> (2) Outer and inner <br> bounds that meet <br> numerically. | $?$ |

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Capacity-achieving schemes by code alignment.

- The problem setting.
- Existing results for $M=2$ [Georgiadis et al. 09].
- New concepts of code alignment and packet evolution.
- Main theorems and numerical evaluation.


## 1-Hop Cellular (AP) Networks

- 1-hop access point networks. $M$ dest.
- $M$ can be large, say $\approx 20$.
- Each session has $n R_{i}$ packets.
- The source $s$ uses the channel $n$ times.

- Our goal is to maximize the achievable rate vector $\left(R_{1}, \cdots, R_{M}\right)$.


## Formal Definition of Feasibility

A network code is defined by the following functions:
info.
channel output feedback
$Y(t)=f_{t}\left(\left\{X_{k, l}: k \in[M], l \in\left[n R_{k}\right]\right\},\left\{Z_{k}(\tau): k \in[M], \tau \in[t-1]\right\}\right)$, $\hat{\mathbf{X}}_{k}=g_{k}\left(\left\{Z_{k}(\tau): \tau \in[n]\right\}\right)$.


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$\hat{\mathbf{X}}_{k}=g_{k}\left(\left\{Z_{k}(\tau): \tau \in[n]\right\}\right)$.
Definition $1\left(R_{1}, \cdots, R_{M}\right)$ is achiev-
 able if $\forall \epsilon>0$, there exist a sufficiently large $n$, a sufficiently large finite field $\mathrm{GF}\left(2^{b}\right)$, and a corresponding network code, such that for independently and uniformly distributed $\mathbf{X}_{k}, k \in[M]$ :

$$
\max _{k \in[M]} \mathrm{P}\left(\hat{\mathbf{X}}_{k} \neq \mathbf{X}_{k}\right)<\epsilon .
$$

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- For $_{0.8} M=2$, w. feedback, the capacity is [Georgiadis et al. 09].


$$
\left\{\begin{array}{l}
\frac{R_{1}}{p_{1 \cup 2}}+\frac{R_{2}}{p_{2}} \leq 1 \\
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\end{array}\right.
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## Georgiadis' Proof

- Outer bound [Ozarow et al. 84]: Introduce auxiliary pipes to convert it into physically degraded channels, for which feedback does not increase the capacity [El Gamal 78].



The cap. of the original CH with feedback
$\prec \quad$ The cap. of the new physically degraded CH with feedback
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- Inner bound: A 2-phase approach. (Creating its own side info.)


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- The CH. parameters become more involved.
- $M=2: p_{12}, p_{12^{c}}, p_{1^{c} 2}, p_{1^{c} 2^{c}}$.
- $M \geq 3$ : the success probability $p_{S \overline{([M] \backslash S)}}$ that a packet is received by and only by $d_{i} \in S$. We have $2^{M}$ such parameters.



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- Can we also quantify the Shannon capacity for $M \geq 3$ ?
- Generalization of the outer bound is straightforward.
- Generalization of the inner bound is more difficult.


## Simple Cap. Outer Bound

- For any permutation $\pi:[M] \mapsto[M]$,
old success probability
$p_{\pi(1)}$

$$
p_{\pi(2)}
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- A capacity outer bound is thus $\forall \pi, \quad \sum_{k=1}^{M} \frac{R_{\pi(k)}}{p_{\cup S_{k}^{\pi}}} \leq 1$.


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Those that have arrived the intended receivers need not be retransmitted!


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Creating New Coding Opp.


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## New Cap. Inner Bound

- We need code alignment [W. ISIT10] in order to recoup the overheard coding opportunities during Phases 2 to $M$.
- That is, the overheard coding vector $[X+Y]$ has to remain aligned in the subsequent mixing stages.
- $[\alpha(X+Y)+\beta Z]$ serves all three destinations, but
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- That is, the overheard coding vector $[X+Y]$ has to remain aligned in the subsequent mixing stages.
- $[\alpha(X+Y)+\beta Z]$ serves all three destinations, but
- $[\alpha X+\beta Y+\gamma Z]$ does not.
- We propose a new Packet Evolution scheme.
- Each information packet (payload) is expanded to (payload, overhearing status, representative coding vector)
- overhearing status keeps evolving to create more coding opportunities.
- representative coding vector keeps evolving to ensure code alignment.


## The Packet Evolution Scheme

Phase 1
Creating New Coding Opp.


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Phase 1
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Phase 2
Exploiting Coding Opp.
\& Creating New Coding Opp.
Phase 3
Exploiting Coding Opp.
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Z


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## An Example of $M=4$

- $M=4$ sessions, each $d_{k}$ has $X_{k, 1}$ to $X_{k, 100}$ packets.
- Each $X_{k, l}, \forall k \in[4], l \in[100]$ has an overhearing status $S\left(X_{k, l}\right) \subseteq\{1,2,3,4\}$, and a representative coding vector $\mathbf{v}\left(X_{k, l}\right)$ being a 400-dimensional vector.


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- Use $S\left(X_{k, l}\right)$ to decide which packets to be coded together.
- Suppose we plan to encode sessions 1, 2, 3 together. We choose three packets $X_{1, l_{1}}, X_{2, l_{2}}$, and $X_{3, l_{3}}$ such that $S\left(X_{1, l_{1}}\right)=\{2,3\}$, $S\left(X_{2, l_{2}}\right)=\{1,3\}$, and $S\left(X_{3, l_{3}}\right)=\{1,2\}$


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- Instead of mixing $X_{1, l_{1}}$ to $X_{3, l_{3}}$, we mix $\mathbf{v}\left(X_{1, l_{1}}\right)$ to $\mathbf{v}\left(X_{3, l_{3}}\right)$.
- Generate $\mathbf{v}_{\mathrm{tx}}$ by $\mathbf{v}_{\mathrm{tx}}=c_{1} \mathbf{v}\left(X_{1, l_{1}}\right)+c_{2} \mathbf{v}\left(X_{2, l_{2}}\right)+c_{3} \mathbf{v}\left(X_{3, l_{3}}\right)$.
- Transmit $Y=\mathbf{v}_{\mathrm{tx}}\left(X_{1,1}, \cdots, X_{4,100}\right)^{\mathrm{T}}$.


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- Suppose we plan to encode sessions 1, 2, 3 together. We choose three packets $X_{1, l_{1}}, X_{2, l_{2}}$, and $X_{3, l_{3}}$ such that $S\left(X_{1, l_{1}}\right)=\{2,3\}$, $S\left(X_{2, l_{2}}\right)=\{1,3\}$, and $S\left(X_{3, l_{3}}\right)=\{1,2\}$
- Instead of mixing $X_{1, l_{1}}$ to $X_{3, l_{3}}$, we mix $\mathbf{v}\left(X_{1, l_{1}}\right)$ to $\mathbf{v}\left(X_{3, l_{3}}\right)$.
- Generate $\mathbf{v}_{\mathrm{tx}}$ by $\mathbf{v}_{\mathrm{tx}}=c_{1} \mathbf{v}\left(X_{1, l_{1}}\right)+c_{2} \mathbf{v}\left(X_{2, l_{2}}\right)+c_{3} \mathbf{v}\left(X_{3, l_{3}}\right)$.
- Transmit $Y=\mathbf{v}_{\mathrm{tx}}\left(X_{1,1}, \cdots, X_{4,100}\right)^{\mathrm{T}}$.
- Upon receiving a feedback, say " $\left\{d_{3}, d_{4}\right\}$ receive $Y$ ":
- Augment overhearing status $S\left(x_{k, l}\right)$ and update representative coding vector $\mathbf{v}\left(x_{k, l}\right)$ :

Create more coding Opp. $S\left(X_{1, l_{1}}\right) \leftarrow S\left(X_{1, l_{1}}\right) \cup\{3,4\}=\{2,3,4\}, \quad \mathbf{v}\left(X_{1, l_{1}}\right) \leftarrow \mathbf{v}_{\mathrm{tx}}$
Create more coding Opp. $S\left(X_{2, l_{2}}\right) \leftarrow S\left(X_{2, l_{2}}\right) \cup\{3,4\}=\{1,3,4\}, \quad \mathbf{v}\left(X_{2, l_{2}}\right) \leftarrow \mathbf{v}_{\mathrm{tx}}$
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$$
\begin{aligned}
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$\square$
$\square$
$\square$

$$
-\frac{n R_{3}}{p_{12} / 3}
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- The analysis of PE schemes becomes a time-slot packing problem: Rx 3

Rx 2
Rx 1


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The joint success prob.
$p_{S} \overline{\{1,2,3\} \backslash S}$ affects the Rx 2 $\square$
$\square$
$\square$ $\frac{n \hat{R_{3}}}{p_{3}}-\frac{n R_{3}}{p_{2 \sim 3}}-\frac{n R_{3}}{p_{1 u 3}}+\frac{n R_{3}}{p_{1 \sim 2 u 3}}$ duration of each status, and thus how to pack

Rx 1 $\square$

$\square$


$$
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$$

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Rx 2
Rx 1


## Capacity Results $M=3$

Based on the Packet Evolution method, we have:
Proposition 1 Consider any 1-to-3 broadcast PEC with channel output feedback with arbitrary parameters $p_{S \overline{(\{1,2,3\} \backslash S)}}$ for all $S \subseteq\{1,2,3\}$.
The capacity region is indeed $\forall \pi, \sum_{k=1}^{M} \frac{R_{\pi(k)}}{p_{\cup S_{k}^{\pi}}} \leq 1$.


6 facets $\Leftrightarrow 6$ different permutations $\pi$

## Capacity Results $M \geq 4$

$$
\text { Outer bound: } \forall \pi, \quad \sum_{k=1}^{M} \frac{R_{\pi(k)}}{p_{\cup S_{k}^{\pi}}} \leq 1
$$

| Settings with general M>3 values | Capacity inner bound results |
| :--- | :--- |
| General $p_{S[M] \backslash S}$ |  |
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| Spatially independent broadcast PECs |  |

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Spatially independent broadcast PECs

$$
p_{S[M] \backslash S}=\prod_{k \in S} p_{k} \prod_{j \in[M] \backslash S}\left(1-p_{j}\right)
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| Spatially independent broadcast PECs | The inner and outer bounds meet when <br> $\left(R_{1}, \cdots, R_{M}\right)$ are one-sided fair |
| $p_{S \overline{L M] \backslash S}}=\prod_{k \in S} p_{k} \prod_{j \in[M] \backslash S}\left(1-p_{j}\right)$ | (when $\left.R_{1} \approx R_{2} \approx \cdots \approx R_{M}\right)$ |

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## Numerical Evaluation

$$
\forall \pi, \sum_{k=1}^{M} \frac{R_{\pi(k)}}{p_{\cup S_{k}^{\pi}}} \leq 1
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Symmetric spatially independent PECs: $p_{1}=p_{2}=\cdots=p_{M}=p$ Perfectly fair systems: $R_{1}=R_{2}=\cdots=R_{M}$

Sum rate capacity $\sum_{k=1}^{M} R_{k}$ vs. marginal success prob. $p$.



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Corollary: When $M \rightarrow \infty$, the channel becomes effectively noiseless. [Larsson et al. 06]

## Summary



Outer bound: $\forall \pi, \quad \sum_{k=1}^{M} \frac{R_{\pi(k)}}{p_{\cup S_{k}^{\pi}}} \leq 1$.
Tight for $M=3$


Settings with general $\mathbf{M}>3$ values
General $p_{S[M] \backslash S}$

Capacity inner bound results

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## One-Sided Fairness

Definition 2 The one-sidedly fair region $\Lambda_{o s f}$ contains all rate vectors $\left(R_{1}, \cdots, R_{M}\right)$ satisfying

$$
\forall i, j \text { satisfying } p_{i}<p_{j}, \text { we have } R_{i}\left(1-p_{i}\right) \geq R_{j}\left(1-p_{j}\right)
$$

Remark 1: A perfectly fair vector $(R, \cdots, R)$ belongs to $\Lambda_{\text {osf }}$. Remark 2: A proportionally fair vector $\left(p_{1} R, \cdots, p_{M} R\right)$ belongs to $\Lambda_{\text {osf }}$ if $\min \left\{p_{k}: \forall k \in[M]\right\} \geq 0.5$.

