# The Multiple Access Channel with Two Independent States each Known Causally to One Encoder 

Amos Lapidoth and Yossef Steinberg

Outline

## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
> The single user channel
, Broadcast channels
, MAC with common SI


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
> The single user channel
, Broadcast channels
, MAC with common SI
- An achievable region for the strictly causal model


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
> The single user channel
, Broadcast channels
, MAC with common SI
- An achievable region for the strictly causal model
- Example


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
> The single user channel
, Broadcast channels
, MAC with common SI
- An achievable region for the strictly causal model
- Example
- An achievable region for the causal model


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
, The single user channel
, Broadcast channels
, MAC with common SI
- An achievable region for the strictly causal model
- Example
- An achievable region for the causal model
- The naïve approach


## Outline

- Problem Formulation: The MAC with strictly causal and causal independent SI
- Background and related results:
> The single user channel
, Broadcast channels
, MAC with common SI
- An achievable region for the strictly causal model
- Example
- An achievable region for the causal model
- The naïve approach
- Example


## Problem Formulation

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

## Outline

MAC with strictly causal side information (SI):


## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


- Two independent state sequences $S_{1}^{n}, S_{2}^{n}$ each known to one encoder in a strictly causal manner:

$$
X_{1, i}=f_{1, i}\left(m_{1}, S_{1}^{i-1}\right), \quad X_{2, i}=f_{2, i}\left(m_{2}, S_{2}^{i-1}\right), \quad i=1, \ldots, n
$$

## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


- Two independent state sequences $S_{1}^{n}, S_{2}^{n}$ each known to one encoder in a strictly causal manner:

$$
\begin{aligned}
& X_{1, i}=f_{1, i}\left(m_{1}, S_{1}^{i-1}\right), \quad X_{2, i}=f_{2, i}\left(m_{2}, S_{2}^{i-1}\right), \quad i=1, \ldots, n \\
& \left(\hat{m}_{1}, \hat{m}_{2}\right)=g\left(Y^{n}\right)
\end{aligned}
$$

## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


- Two independent state sequences $S_{1}^{n}, S_{2}^{n}$ each known to one encoder in a strictly causal manner:

$$
\begin{aligned}
& X_{1, i}=f_{1, i}\left(m_{1}, S_{1}^{i-1}\right), \quad X_{2, i}=f_{2, i}\left(m_{2}, S_{2}^{i-1}\right), \quad i=1, \ldots, n \\
& \left(\hat{m}_{1}, \hat{m}_{2}\right)=g\left(Y^{n}\right)
\end{aligned}
$$

- Transmission is subject to input constraints $\frac{1}{n} \sum_{i=1}^{n} \phi_{k}\left(X_{k, i}\right) \leq \Gamma_{k}, \quad k=1,2$.


## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


- Two independent state sequences $S_{1}^{n}, S_{2}^{n}$ each known to one encoder in a strictly causal manner:

$$
\begin{aligned}
& X_{1, i}=f_{1, i}\left(m_{1}, S_{1}^{i-1}\right), \quad X_{2, i}=f_{2, i}\left(m_{2}, S_{2}^{i-1}\right), \quad i=1, \ldots, n \\
& \left(\hat{m}_{1}, \hat{m}_{2}\right)=g\left(Y^{n}\right)
\end{aligned}
$$

- Transmission is subject to input constraints $\frac{1}{n} \sum_{i=1}^{n} \phi_{k}\left(X_{k, i}\right) \leq \Gamma_{k}, \quad k=1,2$.
- Memoryless, time invariant channel and states $P_{Y \mid S, X_{1}, X_{2}}, P_{S_{1}}, P_{S_{2}}$.


## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


We are interested in $\mathcal{C}_{s-c}^{i}$, the region of all achievable rate and cost pairs

$$
\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)
$$

## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with strictly causal side information (SI):


We are interested in $\mathcal{C}_{s-c}^{i}$, the region of all achievable rate and cost pairs

$$
\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)
$$

$\mathcal{C}_{\mathrm{s}-\mathrm{c}}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right)$ - the collection of all rate pairs $\left(R_{1}, R_{2}\right)$ such that

$$
\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right) \in \mathcal{C}_{\mathrm{s}-\mathrm{c}}^{\mathrm{i}} .
$$

## Problem Formulation

Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with causal SI:


- Two state sequences $S_{1}^{n}, S_{2}^{n}$, each known to one encoder in a causal manner:

$$
\begin{aligned}
& X_{1, i}=f_{1, i}\left(m_{1}, S_{1}^{i}\right), \quad X_{2, i}=f_{2, i}\left(m_{2}, S_{2}^{i}\right), \quad i=1, \ldots, n \\
& \left(\hat{m}_{1}, \hat{m}_{2}\right)=g\left(Y^{n}\right)
\end{aligned}
$$

- Transmission is subject to input constraints $\frac{1}{n} \sum_{i=1}^{n} \phi_{k}\left(X_{k, i}\right) \leq \Gamma_{k}, \quad k=1,2$.

Memoryless, time invariant channel and state $P_{Y \mid S, X_{1}, X_{2}}, P_{S_{1}}, P_{S_{2}}$.

## Problem Formulation

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

Summary

END

MAC with causal SI:


We are interested in $\mathcal{C}_{\text {cau }}^{i}$, the region of all achievable rate and cost pairs

$$
\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)
$$

$\mathcal{C}_{\text {cau }}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right)$ - the collection of all rate pairs $\left(R_{1}, R_{2}\right)$ such that

$$
\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right) \in \mathcal{C}_{\text {cau }}^{\mathrm{i}} .
$$

## The single user channel with SC SI

- Strictly causal SI does not increase the capacity of the single user channel

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary

END

## The single user channel with SC SI

- Strictly causal SI does not increase the capacity of the single user channel


## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary
END

$$
\begin{aligned}
n R-n \epsilon_{n} & \leq I\left(M ; Y^{n}\right)=\sum_{i=1}^{n} I\left(M ; Y_{i} \mid Y^{i-1}\right) \\
& \leq \sum_{i=1}^{n} I\left(M, Y^{i-1} ; Y_{i}\right) \\
& \leq \sum_{i=1}^{n} I\left(M, Y^{i-1}, X_{i} ; Y_{i}\right) \\
& =\sum_{i=1}^{n} I\left(X_{i} ; Y_{i}\right) \\
& \leq \max _{P_{X}} I(X ; Y)=n C
\end{aligned}
$$

where $C$ is the capacity without Sl .

## The single user channel with SC SI

- Strictly causal SI does not increase the capacity of the single user channel (a reminiscent of the situation in feedback capacity)


## The single user channel with SC SI

MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

- Strictly causal SI does not increase the capacity of the single user channel (a reminiscent of the situation in feedback capacity)
- Transmission of the state (or compressed version thereof) to the other side is sub optimal: waste of precious rate, without increase in capacity.


## The single user channel with SC SI

Problem Formulation

Strictly Causal SI Background

- MAC with independent SI streams
- Main result

Partial characterizations

- Example

Causal SI

Summary

END

- Strictly causal SI does not increase the capacity of the single user channel (a reminiscent of the situation in feedback capacity)
- Transmission of the state (or compressed version thereof) to the other side is sub optimal: waste of precious rate, without increase in capacity.

What about networks (BC, MAC)?

## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
Main result
Partial characterizations
Example

Causal SI

Summary

END

## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.
$\Rightarrow$ Equivalent to BC with strictly causal SI , where the state comprises the channel noise

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary
END

## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.
> The encoder transmits the noise to the two users, uncompressed.

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations

- Example

Causal SI

Summary

END

## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.

MAC with independent SI
streams

- Main result

Partial characterizations

- Example

Causal SI

Summary
> The encoder transmits the noise to the two users, uncompressed.

- Knowledge of the additive noise at the decoder facilitates decoding of the messages.


## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.
> The encoder transmits the noise to the two users, uncompressed.
- Knowledge of the additive noise at the decoder facilitates decoding of the messages.
- Although precious rate is spent on transmitting the noise, the net effect is an increase in the capacity region.


## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.
- The encoder transmits the noise to the two users, uncompressed.
- Knowledge of the additive noise at the decoder facilitates decoding of the messages.
- Although precious rate is spent on transmitting the noise, the net effect is an increase in the capacity region.
- Yields gains in capacity also when only lossy transmission of the noise is possible.


## The broadcast channel with SC SI

- An example by Dueck (1980): A non degraded additive noise BC with feedback. The noise is common to the two channels.
- The encoder transmits the noise to the two users, uncompressed.
- Knowledge of the additive noise at the decoder facilitates decoding of the messages.
- Although precious rate is spent on transmitting the noise, the net effect is an increase in the capacity region.
- Yields gains in capacity also when only lossy transmission of the noise is possible.
- In the MAC: If the state is known to both users, they can cooperate in transmitting the noise (state) to the decoder. This strategy enlarges the capacity region of the MAC [Lapidoth \& Steinberg, IZS 2010].


## MAC with SC common SI

[Lapidoth \& Steinberg, IZS2010]:

Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations Example

Causal SI

Summary
END


## MAC with SC common SI

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams
Main result
Partial characterizations Example

Causal SI

Summary
$\mathcal{R}_{\mathrm{sc} \mathrm{c}}^{\text {common }}$ - the CH of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2}, V ; Y\right)-I(V ; S) \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

for some joint distribution

$$
P_{U, V, X_{1}, X_{2}, S, Y}=P_{S} P_{X_{1} \mid U} P_{X_{2} \mid U} P_{U} P_{V \mid S} P_{Y \mid S, X_{1}, X_{2}} .
$$

## MAC with SC common SI

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
Main result
- Partial characterizations Example

Causal SI

Summary

END
$\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ - the CH of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2}, V ; Y\right)-I(V ; S) \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

for some joint distribution

$$
P_{U, V, X_{1}, X_{2}, S, Y}=P_{S} P_{X_{1} \mid U} P_{X_{2} \mid U} P_{U} P_{V \mid S} P_{Y \mid S, X_{1}, X_{2}} .
$$

$$
\begin{aligned}
& X_{1}-U-X_{2} \\
& \left(X_{1}, U, X_{2}\right) \perp(V, S)
\end{aligned}
$$

## MAC with SC common SI

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
Main result
- Partial characterizations Example

Causal SI

Summary

END
$\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ - the CH of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2}, V ; Y\right)-I(V ; S) \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

for some joint distribution

$$
P_{U, V, X_{1}, X_{2}, S, Y}=P_{S} P_{X_{1} \mid U} P_{X_{2} \mid U} P_{U} P_{V \mid S} P_{Y \mid S, X_{1}, X_{2}} .
$$

$$
\begin{aligned}
& X_{1}-U-X_{2} \\
& \left(X_{1}, U, X_{2}\right) \perp(V, S) \\
& V-S-Y
\end{aligned}
$$

## MAC with SC common SI

$\mathcal{R}_{\mathrm{s} \text {-c }}^{\text {common }}$ - the CH of all $\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)$ satisfying

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
Main result
Partial characterizations Example

Causal SI

Summary

END

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2}, V ; Y\right)-I(V ; S) \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

Theorem 1 [L\&S, IZS 2010]
For the MAC with strictly causal SI commonly known by the two encoders, $\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ is achievable.

## MAC with SC common SI

$\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ - the CH of all $\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)$ satisfying

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations

- Example

Causal SI

Summary

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2}, V ; Y\right)-I(V ; S) \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

Theorem 1 [L\&S, IZS 2010]
For the MAC with strictly causal SI commonly known by the two encoders, $\mathcal{R}_{s-c}^{\text {common }}$ is achievable.

Observation: $\mathcal{R}_{s-c}^{\text {common }}$ can be strictly larger than the capacity region without SI .

## Background

We can write $\mathcal{R}_{s-c}^{\text {common }}$ as

- Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations Example

Causal SI

Summary

END

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{0}+R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V\right) \\
R_{0} & \geq I(V ; S)-I(V ; Y) . \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

## Background

## Outline

Strictly Causal SI
Background

- MAC with independent SI
streams
Main result
Partial characterizations Example

Causal SI

Summary

## Problem Formulation

We can write $\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ as

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{0}+R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V\right) \\
R_{0} & \geq I(V ; S)-I(V ; Y) . \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

Based on MAC with common messages + block Markov scheme:

## Background

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END
$\qquad$ SI

We can write $\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ as
$\square$

## Background

## Outline

Problem Formulation

Strictly Causal SI Background

- MAC with independent SI streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END
$\qquad$

We can write $\mathcal{R}_{\mathrm{s}-\mathrm{c}}^{\text {common }}$ as

$$
\begin{aligned}
R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, U, V\right) \\
R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, U, V\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid U, V\right) \\
R_{0}+R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V\right) \\
R_{0} & \geq I(V ; S)-I(V ; Y) . \\
\Gamma_{k} & \geq \mathrm{E}\left[\phi_{k}\left(X_{k}\right)\right], \quad k=1,2
\end{aligned}
$$

Based on MAC with common messages + block Markov scheme:

- The state sequence $S^{n}$ is compressed by a Wyner-Ziv scheme, with coding random variable $V$, and decoder side information $Y^{n}$.
- The compressed state is transmitted to the decoder in the next transmission block as a common message, together with the independent messages $m_{1}, m_{2}$.


## Background

We can write $\mathcal{R}_{s-c}^{\text {common }}$ as

Outline
Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary
$\qquad$
SI
$\square$

Based on MAC with common messages + block Markov scheme:

- The state sequence $S^{n}$ is compressed by a Wyner-Ziv scheme, with coding random variable $V$, and decoder side information $Y^{n}$.
- The compressed state is transmitted to the decoder in the next transmission block as a common message, together with the independent messages $m_{1}, m_{2}$.
- Cooperation is possible, since the state is common.


## MAC with independent SI streams

Back to our problem:

Outine

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations Example

Causal SI

Summary


## MAC with independent SI streams

Back to our problem:

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END


- The two encoders cannot establish cooperation of any kind


## MAC with independent SI streams

Back to our problem:

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END


- The two encoders cannot establish cooperation of any kind Joint transmission of the states is not possible.


## MAC with independent SI streams

Back to our problem:

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END


- The two encoders cannot establish cooperation of any kind Joint transmission of the states is not possible.
- Each of the encoders is working alone - like in the single user channel.


## MAC with independent SI streams

Back to our problem:

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations

- Example

Causal SI

Summary

END


- The two encoders cannot establish cooperation of any kind Joint transmission of the states is not possible.
- Each of the encoders is working alone - like in the single user channel.
- In this setup, is SC SI beneficial at all?


## MAC with independent SI streams

Back to our problem:

## Outline

Problem Formulation

Strictly Causal SI

- Background
- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary

END


- The two encoders cannot establish cooperation of any kind Joint transmission of the states is not possible.
- Each of the encoders is working alone - like in the single user channel.
- In this setup, is SC SI beneficial at all?
- If it is beneficial, is it a good idea to compress and transmit the states to the other side?


## Main result

## - Outline

Problem Formulation

Strictly Causal SI

- Background
- MAC with independent SI streams
- Main result

Partial characterizations - Example

Causal SI

Summary
$\qquad$
SI

Let $\mathcal{R}_{\mathrm{sc}}^{\mathrm{i}}$ be the convex hull of the collection of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying


## Main result

Let $\mathcal{R}_{\mathrm{sc}}^{\mathrm{i}}$ be the convex hull of the collection of all $\left(R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}\right)$ satisfying

Outine

Problem Formulation

Strictly Causal SI

- Background
- MAC with independent SI streams
- Main result
- Partial characterizations

Example

Causal SI

Summary
END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
\end{gathered}
$$

## Main result

## - Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END
$\qquad$
SI

Let $\mathcal{R}_{\mathrm{sc}}^{\mathrm{i}}$ be the convex hull of the collection of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying
$\square$

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
\end{gathered}
$$

$X_{1}, X_{2}$ are independent of each other and of the quadruple ( $V_{1}, V_{2}, S_{1}, S_{2}$ ).

## Main result

Let $\mathcal{R}_{\mathrm{sc}}^{\mathrm{i}}$ be the convex hull of the collection of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI streams
- Main result
- Partial characterizations

Example

Causal SI

Summary

END
$\qquad$
SI
(

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
\end{gathered}
$$

$X_{1}, X_{2}$ are independent of each other and of the quadruple ( $V_{1}, V_{2}, S_{1}, S_{2}$ ).

$$
\left(V_{1}, S_{1}\right) \perp\left(V_{2}, S_{2}\right)
$$

## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI streams
Main result
Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

Theorem 2 (Strictly-Causal, independent SI streams)

$$
\mathcal{R}_{\mathrm{sc}}^{\mathrm{i}} \subseteq \mathcal{C}_{\mathrm{sc}}^{i}
$$

## Main result

## - Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary

END

## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

- The state sequences $S_{1}^{n}, S_{2}^{n}$ are compressed by a distributed Wyner-Ziv scheme, with coding random variable $V_{1}, V_{2}$ and decoder side information $Y^{n}$.


## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations
Example

Causal SI

Summary END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

- The state sequences $S_{1}^{n}, S_{2}^{n}$ are compressed by a distributed Wyner-Ziv scheme, with coding random variable $V_{1}, V_{2}$ and decoder side information $Y^{n}$.

$$
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
$$

## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

- The state sequences $S_{1}^{n}, S_{2}^{n}$ are compressed by a distributed Wyner-Ziv scheme, with coding random variable $V_{1}, V_{2}$ and decoder side information $Y^{n}$.

$$
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
$$

- The compressed states are transmitted to the decoder in the next transmission block as independent codewords, together with the independent messages $m_{1}$, $m_{2}$.


## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

- The state sequences $S_{1}^{n}, S_{2}^{n}$ are compressed by a distributed Wyner-Ziv scheme, with coding random variable $V_{1}, V_{2}$ and decoder side information $Y^{n}$.

$$
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
$$

- The compressed states are transmitted to the decoder in the next transmission block as independent codewords, together with the independent messages $m_{1}$, $m_{2}$.

$$
X_{1} \perp X_{2}, \quad \text { independent of }\left(V_{1}, V_{2}, S_{1}, S_{2}\right) .
$$

## Main result

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations
Example

Causal SI

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

A block Markov scheme:

- The state sequences $S_{1}^{n}, S_{2}^{n}$ are compressed by a distributed Wyner-Ziv scheme, with coding random variable $V_{1}, V_{2}$ and decoder side information $Y^{n}$.

$$
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y
$$

- The compressed states are transmitted to the decoder in the next transmission block as independent codewords, together with the independent messages $m_{1}$, $m_{2}$.

$$
X_{1} \perp X_{2}, \quad \text { independent of }\left(V_{1}, V_{2}, S_{1}, S_{2}\right) \text {. }
$$

- The two codes are decoupled.


## Partial characterizations

Two propositions - about the sum rate, and about the asymmetric case.

Outine

Problem Formulation

Strictly Causal SI

- Background
- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary

END

## Partial characterizations

Strictly Causal SI
Background

- MAC with independent SI streams
Main result
- Partial characterizations Example

Causal SI

Summary

Two propositions - about the sum rate, and about the asymmetric case.
Proposition 1 Strictly-causal independent SI does not increase the sum-rate capacity:

$$
\mathcal{C}_{\Sigma, s-c}^{i}\left(\Gamma_{1}, \Gamma_{2}\right)=\max I\left(X_{1}, X_{2} ; Y\right),
$$

where the maximum is over all product distributions $P_{X_{1}} P_{X_{2}}$ satisfying the input constraints

$$
\mathbb{E} \phi_{k}\left(X_{k}\right) \leq \Gamma_{k}, \quad k=1,2 .
$$

## Partial characterizations

Strictly Causal SI

- Background
- MAC with independent SI
streams
- Main result
- Partial characterizations

Example

Causal SI

Summary

The asymmetric case:
Proposition 2 Let $S_{2}$ be deterministic. Then the maximal rate of User 1 with strictly causal SI is equal to its single user capacity without SI

$$
\max \left\{R_{1}:\left(R_{1}, 0\right) \in \mathcal{C}_{s-\mathrm{c}}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right)\right\}=\max I\left(X_{1} ; Y \mid X_{2}\right),
$$

where the maximum in the right hand side is over all $P_{X_{1}} P_{X_{2}}$ satisfying the input constraints

$$
\mathbb{E} \phi_{k}\left(X_{k}\right) \leq \Gamma_{k}, \quad k=1,2 .
$$

## Example

The Gaussian MAC where the state $S_{1}$ comprises the channel noise, and $S_{2}$ is null:

Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result
- Partial characterizations
- Example

Causal SI

Summary
END

$$
\begin{aligned}
& Y=X_{1}+X_{2}+S_{1}, \quad S_{1} \sim \mathcal{N}\left(0, \sigma_{s_{1}}^{2}\right) \\
& \mathrm{E}\left[X_{1}^{2}\right] \leq \Gamma_{1}, \quad \mathrm{E}\left[X_{2}^{2}\right] \leq \Gamma_{2} .
\end{aligned}
$$

## Example

## Outline

Problem Formulation

Strictly Causal SI
Background

- MAC with independent SI
streams
- Main result

Partial characterizations

- Example

Causal SI

Summary

END

The Gaussian MAC where the state $S_{1}$ comprises the channel noise, and $S_{2}$ is null:

$$
\begin{aligned}
& Y=X_{1}+X_{2}+S_{1}, \quad S_{1} \sim \mathcal{N}\left(0, \sigma_{s_{1}}^{2}\right) \\
& \mathrm{E}\left[X_{1}^{2}\right] \leq \Gamma_{1}, \quad \mathrm{E}\left[X_{2}^{2}\right] \leq \Gamma_{2}
\end{aligned}
$$

$\mathcal{C}_{\mathrm{s}-\mathrm{c}}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right)$ is the collection of all rate-pairs $\left(R_{1}, R_{2}\right)$ satisfying

$$
\begin{aligned}
R_{1} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}}{\sigma_{s_{1}}^{2}}\right) \\
R_{1}+R_{2} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}+\Gamma_{2}}{\sigma_{s_{1}}^{2}}\right)
\end{aligned}
$$

## Example

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations

- Example

Causal SI

Summary

END

The Gaussian MAC where the state $S_{1}$ comprises the channel noise, and $S_{2}$ is null:

$$
\begin{aligned}
& Y=X_{1}+X_{2}+S_{1}, \quad S_{1} \sim \mathcal{N}\left(0, \sigma_{s_{1}}^{2}\right) \\
& \mathrm{E}\left[X_{1}^{2}\right] \leq \Gamma_{1}, \quad \mathrm{E}\left[X_{2}^{2}\right] \leq \Gamma_{2} .
\end{aligned}
$$

$\mathcal{C}_{\mathrm{s}-\mathrm{c}}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right)$ is the collection of all rate-pairs $\left(R_{1}, R_{2}\right)$ satisfying

$$
\begin{aligned}
R_{1} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}}{\sigma_{s_{1}}^{2}}\right) \\
R_{1}+R_{2} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}+\Gamma_{2}}{\sigma_{s_{1}}^{2}}\right) .
\end{aligned}
$$

## Proof:

Direct part: good choice of random variables in $\mathcal{R}_{\mathrm{sc}}^{i}$.

## Example

## Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result

Partial characterizations

- Example

Causal SI

Summary

END

The Gaussian MAC where the state $S_{1}$ comprises the channel noise, and $S_{2}$ is null:

$$
\begin{gathered}
Y=X_{1}+X_{2}+S_{1}, \quad S_{1} \sim \mathcal{N}\left(0, \sigma_{s_{1}}^{2}\right) \\
\mathrm{E}\left[X_{1}^{2}\right] \leq \Gamma_{1}, \quad \mathrm{E}\left[X_{2}^{2}\right] \leq \Gamma_{2} . \\
\mathcal{C}_{s-\mathrm{c}}^{\mathrm{i}}\left(\Gamma_{1}, \Gamma_{2}\right) \text { is the collection of all rate-pairs }\left(R_{1}, R_{2}\right) \text { satisfying }
\end{gathered}
$$

$$
\begin{aligned}
R_{1} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}}{\sigma_{s_{1}}^{2}}\right) \\
R_{1}+R_{2} & \leq \frac{1}{2} \log \left(1+\frac{\Gamma_{1}+\Gamma_{2}}{\sigma_{s_{1}}^{2}}\right) .
\end{aligned}
$$

## Proof:

Direct part: good choice of random variables in $\mathcal{R}_{\mathrm{sc}}^{i}$.
Converse: use Propositions 1 and 2.

## Example

## - Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result
- Partial characterizations

Example

Causal SI

Summary

END


## Example

Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams

- Main result
- Partial characterizations

Example

Causal SI

Summary

END


- User 1 knows the noise in a strictly causal manner, but cannot utilize it to increase his own rate.


## Example

Outline

Problem Formulation

Strictly Causal SI
Background
MAC with independent SI
streams
Main result

- Partial characterizations

Example

Causal SI

Summary

END


- User 1 knows the noise in a strictly causal manner, but cannot utilize it to increase his own rate.
- He can use it to increase the rate of User 2.


## MAC with causal SI

The region we had for the strictly causal case is still achievable

## Outline

Problem Formulation

Strictly Causal SI

## Causal SI

- MAC with causal SI - main result
- The naïve approach
- Example

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

## MAC with causal SI

The region we had for the strictly causal case is still achievable

## - Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

with the Markov conditions

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y \\
X_{1} \perp X_{2}, \quad\left(X_{1}, X_{2}\right) \perp\left(V_{1}, V_{2}, S_{1}, S_{2}\right) .
\end{gathered}
$$

## MAC with causal SI

The region we had for the strictly causal case is still achievable

## Outline

Problem Formulation

Strictly Causal SI

Causal SI
D MAC with causal SI - main
result
The naïve approach

- Example

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

with the Markov conditions

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y \\
X_{1} \perp X_{2}, \quad\left(X_{1}, X_{2}\right) \perp\left(V_{1}, V_{2}, S_{1}, S_{2}\right) .
\end{gathered}
$$

But now, $X_{1}, X_{2}$ can depend on $S$.

## MAC with causal SI

The region we had for the strictly causal case is still achievable

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

END

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

with the Markov conditions

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y \\
X_{1} \perp X_{2}, \quad\left(X_{1}, X_{2}\right) \perp\left(V_{1}, V_{2}, S_{1}, S_{2}\right) .
\end{gathered}
$$

But now, $X_{1}, X_{2}$ can depend on $S$.
$\Rightarrow$ Use Shannon strategies on top of our block Markov scheme.

## MAC with causal SI

The region we had for the strictly causal case is still achievable

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(X_{1} ; Y \mid X_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(X_{2} ; Y \mid X_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(X_{1}, X_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

with the Markov conditions

$$
\begin{gathered}
V_{1}-S_{1}-\left(V_{2}, Y, S_{2}\right) \\
V_{2}-S_{2}-\left(V_{1}, Y, S_{1}\right) \\
\left(V_{1}, V_{2}\right)-\left(S_{1}, S_{2}\right)-Y \\
X_{1} \perp X_{2}, \quad\left(X_{1}, X_{2}\right) \perp\left(V_{1}, V_{2}, S_{1}, S_{2}\right) .
\end{gathered}
$$

But now, $X_{1}, X_{2}$ can depend on $S$.
Replace ( $X_{1}, X_{2}$ ) by ( $U_{1}, U_{2}$ ) independent of ( $S_{1}, S_{2}$ ), and let

$$
P_{X_{1} \mid U_{1}, S_{1}}, \quad P_{X_{2} \mid U_{2}, S_{2}}
$$

## Main result

## Outline

Problem Formulation

Strictly Causal SI

Causal SI
MAC with causal SI - main
result

- The naïve approach
- Example

Summary
$\mathcal{R}_{\text {cau }}^{\mathrm{i}}$ - the CH of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(U_{1} ; Y \mid U_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(U_{2} ; Y \mid U_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(U_{1}, U_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

for some ( $V_{1}, V_{2}, U_{1}, U_{2}, S_{1}, S_{2}, X_{1}, X_{2}, Y$ ) with joint distribution

$$
P_{V_{1} \mid S_{1}} P_{V_{2} \mid S_{2}} P_{U_{1}} P_{U_{2}} P_{S_{1}} P_{S_{2}} P_{X_{1} \mid U_{1}, S_{1}} P_{X_{2} \mid U_{2}, S_{2}} P_{Y \mid S_{1}, S_{2}, X_{1}, X_{2}} .
$$

## Main result

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

END
$\mathcal{R}_{\text {cau }}^{i}$ - the CH of all ( $R_{1}, R_{2}, \Gamma_{1}, \Gamma_{2}$ ) satisfying

$$
\begin{aligned}
0 \leq R_{1} & \leq I\left(U_{1} ; Y \mid U_{2}, V_{1}, V_{2}\right)-I\left(V_{1} ; S_{1} \mid Y, V_{2}\right) \\
0 \leq R_{2} & \leq I\left(U_{2} ; Y \mid U_{1}, V_{1}, V_{2}\right)-I\left(V_{2} ; S_{2} \mid Y, V_{1}\right) \\
R_{1}+R_{2} & \leq I\left(U_{1}, U_{2} ; Y \mid V_{1}, V_{2}\right)-I\left(V_{1}, V_{2} ; S_{1}, S_{2} \mid Y\right) \\
\Gamma_{k} & \geq \mathbb{E} \phi_{k}\left(X_{k}\right), \quad k=1,2
\end{aligned}
$$

for some ( $V_{1}, V_{2}, U_{1}, U_{2}, S_{1}, S_{2}, X_{1}, X_{2}, Y$ ) with joint distribution

$$
P_{V_{1} \mid S_{1}} P_{V_{2} \mid S_{2}} P_{U_{1}} P_{U_{2}} P_{S_{1}} P_{S_{2}} P_{X_{1} \mid U_{1}, S_{1}} P_{X_{2} \mid U_{2}, S_{2}} P_{Y \mid S_{1}, S_{2}, X_{1}, X_{2}} .
$$

Theorem 3 (Causal, independent SI streams)

$$
\mathcal{R}_{\mathrm{cau}}^{\mathrm{i}} \subseteq \mathcal{C}_{\mathrm{cau}}^{i}
$$

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state.
Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all ( $R_{1}, R_{2}$ ) satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$.

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all ( $R_{1}, R_{2}$ ) satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

END

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$. Here
$T_{k}, k=1,2$ are random Shannon strategies:
$T_{k} \in \mathcal{T}_{k}, \quad$ the set of mappings $t_{k}: \mathcal{S}_{k} \rightarrow \mathcal{X}_{k}$

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all ( $R_{1}, R_{2}$ ) satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$. Here
$T_{k}, k=1,2$ are random Shannon strategies:
$T_{k} \in \mathcal{T}_{k}, \quad$ the set of mappings $t_{k}: \mathcal{S}_{k} \rightarrow \mathcal{X}_{k}$
$Q$ is a time sharing random variable,

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all ( $R_{1}, R_{2}$ ) satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$. Here
$T_{k}, k=1,2$ are random Shannon strategies:

$$
T_{k} \in \mathcal{T}_{k}, \quad \text { the set of mappings } \quad t_{k}: \mathcal{S}_{k} \rightarrow \mathcal{X}_{k}
$$

$Q$ is a time sharing random variable, and

$$
\begin{aligned}
P_{Y \mid T_{1}, T_{2}}\left(y \mid t_{1}, t_{2}\right)= & \sum_{s_{1} \in \mathcal{S}_{1}} \sum_{s_{2} \in \mathcal{S}_{2}} P_{S_{1}}\left(s_{1}\right) P_{S_{2}}\left(s_{2}\right) \\
& \cdot P_{Y \mid S_{1}, S_{2}, X_{1}, X_{2}}\left(y \mid s_{1}, s_{2}, t_{1}\left(s_{1}\right), t_{2}\left(s_{2}\right)\right)
\end{aligned}
$$

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all $\left(R_{1}, R_{2}\right)$ satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$.

We denote this region as $\mathcal{R}^{\text {naive }}$.

## The naïve approach

The naïve approach - using Shannon strategies, without block Markov coding of the state. It leads to the region of all $\left(R_{1}, R_{2}\right)$ satisfying

## Outline

Problem Formulation

Strictly Causal SI

Causal SI
D MAC with causal SI - main
result

- The naïve approach
- Example


## Summary

END

$$
\begin{aligned}
R_{1} & \leq I\left(T_{1} ; Y \mid T_{2}, Q\right) \\
R_{2} & \leq I\left(T_{2} ; Y \mid T_{1}, Q\right) \\
R_{1}+R_{2} & \leq I\left(T_{1}, T_{2} ; Y \mid Q\right)
\end{aligned}
$$

for some joint distribution $P_{Q} P_{T_{1} \mid Q} P_{T_{2} \mid Q} P_{Y \mid T_{1}, T_{2}}$.

We denote this region as $\mathcal{R}^{\text {naive }}$.
$\mathcal{R}^{\text {naive }}$ contains the region suggested in [S.A. Jafar, Dec 2006].

## The naïve approach

Outline

Problem Formulation

Strictly Causal SI

Causal SI
MAC with causal SI - main
result

- The naïve approach
- Example

Summary

- $\mathcal{R}_{\text {cau }}^{i}$ contains the region of the naïve approach, since we can always choose deterministic $\left(V_{1}, V_{2}\right)$.
- In some cases, the inclusion is strict.


## Example

The asymmetric state-dependent MAC consisting of two single user channels:

## Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
-The naïve approach
- Example


## Summary

## Example

The asymmetric state-dependent MAC consisting of two single user channels:

## - Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example

Summary

$$
\mathcal{X}_{1}=\{0,1\}, \quad \mathcal{X}_{2}=\{0,1,2,3\}, \quad \mathcal{Y}=\mathcal{Y}_{1} \times \mathcal{Y}_{2}
$$

$$
\mathcal{Y}_{1}=\{0,1\}, \quad \mathcal{Y}_{2}=\{0,1,2,3\}
$$

The channel is defined as

$$
\begin{aligned}
Y_{1} & =X_{1} \\
Y_{2} & =X_{2} \oplus S_{1}
\end{aligned}
$$

## Example

The asymmetric state-dependent MAC consisting of two single user channels:

## Outline

Problem Formulation

Strictly Causal SI

Causal SI
-MAC with causal SI - main
result
-The naïve approach

- Example

Summary
END

$$
\mathcal{X}_{1}=\{0,1\}, \quad \mathcal{X}_{2}=\{0,1,2,3\}, \quad \mathcal{Y}=\mathcal{Y}_{1} \times \mathcal{Y}_{2}
$$

$$
\mathcal{Y}_{1}=\{0,1\}, \quad \mathcal{Y}_{2}=\{0,1,2,3\}
$$

The channel is defined as

$$
\begin{aligned}
Y_{1} & =X_{1} \\
Y_{2} & =X_{2} \oplus S_{1}
\end{aligned}
$$

where

$$
\mathcal{S}_{1}=\{0,1,2,3\}, \quad P_{S_{1}}=(1-p, p / 3, p / 3, p / 3), \quad H\left(S_{1}\right)<1
$$

## Example

## - Outline

Problem Formulation

Strictly Causal SI

## Causal SI

MAC with causal SI - main
result

- The naïve approach
- Example


## Summary

## Example

Outline

Problem Formulation

Strictly Causal SI

Causal SI
MAC with causal SI - main
result

- The naïve approach
- Example


## Summary

## Example

Outline

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
- The naïve approach
- Example


## Summary

$$
\begin{array}{lll}
Y_{1}=X_{1}, & \text { binary } \\
Y_{2}=X_{2} \oplus S_{1}, & & \text { quaternary with } H\left(S_{1}\right)<1 .
\end{array}
$$

What is the maximal transmission rate of user 2 under each of the schemes?

- The block Markov coding scheme yields $R_{2, \max }^{(\mathrm{bm})}=2$.


## Example

Outline

Problem Formulation

Strictly Causal SI

Causal SI
-MAC with causal SI - main
result
The naïve approach

- Example

Summary

$$
\begin{array}{lll}
Y_{1}=X_{1}, & \text { binary } \\
Y_{2}=X_{2} \oplus S_{1}, & & \text { quaternary with } H\left(S_{1}\right)<1 .
\end{array}
$$

What is the maximal transmission rate of user 2 under each of the schemes?

- The block Markov coding scheme yields $R_{2, \max }^{(\mathrm{bm})}=2$.

Achievability - by proper choice of random variables in $\mathcal{R}_{\text {cau }}^{i}$.

## Example

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
The naïve approach
- Example


## Summary

$$
\begin{array}{lll}
Y_{1}=X_{1}, & \text { binary } \\
Y_{2}=X_{2} \oplus S_{1}, & & \text { quaternary with } H\left(S_{1}\right)<1 .
\end{array}
$$

What is the maximal transmission rate of user 2 under each of the schemes?

- The block Markov coding scheme yields $R_{2, \max }^{(\mathrm{bm})}=2$.

Achievability - by proper choice of random variables in $\mathcal{R}_{\text {cau }}^{i}$.
This is tight, since $\left|\mathcal{X}_{2}\right|=4$.

## Example

Problem Formulation

Strictly Causal SI

Causal SI

- MAC with causal SI - main
result
The naïve approach
- Example


## Summary

$$
\begin{array}{lll}
Y_{1}=X_{1}, & \text { binary } \\
Y_{2}=X_{2} \oplus S_{1}, & & \text { quaternary with } H\left(S_{1}\right)<1 .
\end{array}
$$

What is the maximal transmission rate of user 2 under each of the schemes?

- The block Markov coding scheme yields $R_{2, \max }^{(\mathrm{bm})}=2$.

Achievability - by proper choice of random variables in $\mathcal{R}_{\text {cau }}^{i}$.
This is tight, since $\left|\mathcal{X}_{2}\right|=4$.

- It can be shown that $R_{2, \max }^{\text {(naive }}<2$.


## Summary

- Derived achievable region for the MAC with two independent strictly causal SI streams, based on block Markov encoding of the state.
- Although cooperation between the users is impossible in this setup, strictly causal SI enlarges the capacity region of the MAC.
- Extended the results to causal SI
- The new region for causal SI is strictly better than the region obtained by the naïve approach, which utilizes only Shannon strategies without block-Markov coding.


## Thank You!

