# Source Coding with Common Reconstruction and Action-dependent Side Information

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### Outline



Motivation and Related Work



### Main Problem

- Main Result
- Proof Outline
- Example



# Related Work: Source Coding with Side Information

• Source coding with side information at the decoder [Wyner and Ziv '76]



 Source coding with action-dependent side information "Vending machine" [Weissman and Permuter '09]



 $\Rightarrow$  Decoder can adjust the quality of SI.

# Related Work: Source Coding with Side Information

- Lossy source coding  $\Rightarrow$  distortion constraint
- What if the encoder wants to know the decoder reconstruction as well? ⇒ Common Reconstruction (CR) constraint [Steinberg '09]



- $\Rightarrow \lim_{n\to\infty} \Pr(\psi(X^n) \neq \hat{X}^n)) = 0$
- ⇒ Medical consultation (MRI results) [Steinberg '09]
- ⇒ Both sender and receiver share common knowledge of receiver's reconstruction, i.e.,  $\hat{X}^n$ .

### **Our Contribution**

 Combining the action-dependent SI and CR constraint for the source coding problem.



Figure: Action-dependent SI where action is chosen at the encoder and depends on a rate-limited link

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- Active control: Action-dependent SI
- Passive control: CR constraint
- Potential application in networked control

### **Problem Formulation**



- Encoder:  $f^{(n)}: \mathcal{X}^n \to \mathcal{W}^{(n)} \times \mathcal{T}^{(n)}, |\mathcal{W}^{(n)}| = 2^{nR_1}, |\mathcal{T}^{(n)}| = 2^{nR_2}$ • Decoder:  $g^{(n)}: \mathcal{W}^{(n)} \times \mathcal{T}^{(n)} \times S^n_d \to \tilde{\mathcal{X}}^n$
- CR mapping:  $\psi^{(n)}: \mathcal{X}^n \times \mathcal{A}^n \to \hat{\mathcal{X}}^n, \ \hat{\mathcal{X}}^n = \tilde{\mathcal{X}}^n$

Goal: To find the rate region subject to

 $E[d(X^n, \tilde{X}^n)] \le D, \ E[\Lambda(A^n)] \le C, \ \lim_{n \to \infty} \Pr\left(\psi^{(n)}(X^n, A^n) \neq \tilde{X}^n\right) = 0.$ 

### **Rate Region**

### **Definition: Rate Region**

Let  $\mathcal{P}(D, C)$  denote the set of all joint pmfs p which have the form

 $P_X(x)P_{A|X}(a|x)P_{S_d|X,A}(s_d|x,a)P_{\hat{X}|X,A}(\hat{x}|x,a),$ 

and satisfy

$$E\left[d(X, \hat{X})\right] \le D$$
, and  $E[\Lambda(A)] \le C$ .

For each  $p \in \mathcal{P}(D, C)$ , define

$$\mathcal{R}^*(D, C, p) \triangleq \{ (R_1, R_2) : R_1, R_2 \ge 0, R_1 + R_2 \ge I(X; \hat{X}, A) - I(\hat{X}; S_d | A) \},\$$

and

$$\mathcal{R}^*(D,C) \triangleq \bigcup_{p \in \mathcal{P}(D,C)} \mathcal{R}^*(D,C,p).$$

### Theorem: Optimal Rate Region

The optimal rate region containing all achievable rate pairs for the memoryless source with action-dependent side information available at the decoder is given by

$$\mathcal{R}(D,C)=\mathcal{R}^*(D,C).$$

Remark:

⇒ No  $S_d$  in the distortion constraint  $E[d(X, \hat{X})] \le D$  (different from that in Wyner-Ziv!)

### Sum-rate Distortion and Cost Function

### Corollary: Sum-rate distortion and cost function

The sum-rate distortion and cost function for the memoryless source with CR and action-dependent SI available at the decoder is given by

$$R_{ac,cr}(D,C) = \min_{p \in \mathcal{P}(D,C)} [I(X;\hat{X},A) - I(\hat{X};S_d|A)]$$
  
$$\stackrel{(*)}{=} \min_{p \in \mathcal{P}(D,C)} [I(X;A) + I(\hat{X};X|A,S_d)],$$

(\*) follows from the Markov chain  $\hat{X} - (X, A) - S_d$ .

# Outline of the Proof

The proof follows from arguments in [Wyner and Ziv '76], [Weissman and Permuter '09], and [Steinberg '09].



- Achievability: using a random coding argument
  - Codebook generation:  $a^n(w) \sim P_A$ , and  $\hat{x}^n(t, v, w) \sim P_{\hat{X}|A}$
  - **Encoding**: given the source, find (t, v, w) s.t.  $\hat{x}^n, x^n$ , and  $a^n$  are jointly typical, then transmit t, w to the decoder and w to the action decoder. Also, put out  $\hat{x}^n(t, v, w)$  as CR.
  - **Decoding**: put out  $\tilde{x}^n = \hat{x}^n$  which is jointly typical with  $a^n$  and  $s^n_d$
  - $\Rightarrow$  Typicality guarantees the distortion, cost and CR constraints.
- Converse: standard information-theoretic argument

### Example: To observe, or not to observe SI

• Comparing  $R_{ac,cr}(D,C)$  to  $R_{ac}(D,C)$  (without CR constraint)

• Consider the binary sets  $X = \hat{X} = S_d = \mathcal{A} = \{0, 1\}$ 

X ~ Bern(1/2)

• 
$$A = 1 \Rightarrow$$
 observe  $S_d$ 



- Assume that an observation has a unit cost, i.e., Λ(A) = A and E[Λ(A)] = P<sub>A</sub>(1) = C
- Consider the Hamming distance as a distortion measure

### **Rate-Distortion Curves**



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Performance loss due to CR constraint



- Source coding problem with action-dependent SI and CR (extension of Wyner-Ziv)
- The rate region is characterized (depending only on the sum rate constraint)
- Potential application in networked control

Thank you for your attention!



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