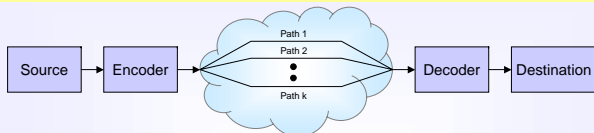


## Introduction

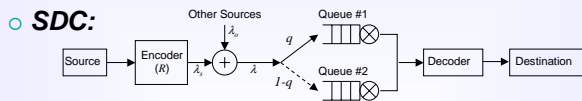


- Problem:** Choose the *routing parameters* together with the *coding parameters* to minimize average *end-to-end distortion*
- Motivation:** Coupling of different network layers
  - Parallel routing (**layer 3**): uses diversity but introduces extra delays
  - Source coding (**layer 6**): compression
- Trade-off:** Distortion vs. Delay
  - want less distortion  $\rightarrow$  need longer packets  $\rightarrow$  more delay

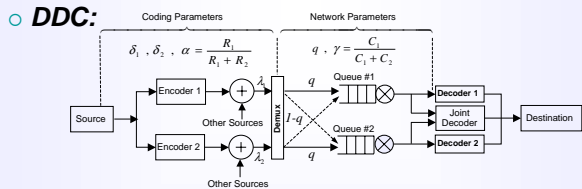
## Model

- Source:** Gaussian, Delay-sensitive: packets that arrive later than  $\Delta$  sec are useless

### Encoder:



- SDC:**
  - Each source symbol encoded into one packet (description)
  - Expected packet length:  $R$  bits
  - greater  $R \rightarrow$  smaller distortion  $\rightarrow$  longer delay



- DDC:**
  - Each source symbol encoded into 2 packets
  - expected description lengths:  $R_1, R_2 < R$  bits
  - Each DDC description carries less info than SDC packet
  - If  $R_1 + R_2 = R$ , both descriptions can jointly carry as much info as an SDC packet
  - DDC: more flexibility without adding extra traffic load

## End-to-End Distortion

### SDC:

$$D_{SDC} = \begin{cases} 2^{-2R} & \text{if } T \leq \Delta \\ 1 & \text{if } T > \Delta \end{cases}$$

$$\bar{D}_{SDC} = 2^{-2R} \Pr[T \leq \Delta] + \Pr[T > \Delta]$$

- Objective

$$(R^*, q^*) = \arg \min_{(R, q)} \bar{D}_{SDC}$$

### DDC:

$$D_{DDC} = \begin{cases} d_0 = 2^{-2(R_1+R_2)} \frac{1}{1-(\sqrt{\Pi}-\sqrt{\Lambda T})^2} & \text{if } T^1 \leq \Delta \& T^2 \leq \Delta \\ d_1 = 2^{-2R_1(1-\delta_1)} & \text{if } T^1 \leq \Delta \& T^2 > \Delta \\ d_2 = 2^{-2R_2(1-\delta_2)} & \text{if } T^1 > \Delta \& T^2 \leq \Delta \\ 1 & \text{if } T^1 > \Delta \& T^2 > \Delta \end{cases}$$

$$0 \leq \delta_1, \delta_2 \leq 1, \quad \Pi = (1-d_1)(1-d_2) \quad \& \quad \Lambda = d_1 d_2 2^{-2(R_1+R_2)}$$

$$\bar{D}_{DDC} = d_0 P[T^1 \leq \Delta, T^2 \leq \Delta] + d_1 P[T^1 \leq \Delta, T^2 > \Delta] + d_2 P[T^1 > \Delta, T^2 \leq \Delta] + P[T^1 > \Delta, T^2 > \Delta]$$

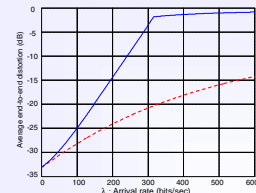
- $\delta$ : redundancy of encoder  $i$

**small  $\delta$** : good individual descriptions that jointly contribute little  
**large  $\delta$** : not individually good descriptions but jointly can achieve same distortion as SDC

- Objective

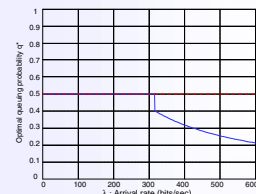
$$(R_1^*, R_2^*, q^*, \delta_1^*, \delta_2^*) = \arg \min_{(R_1, R_2, q, \delta_1, \delta_2)} \bar{D}_{DDC}$$

## SDC Results



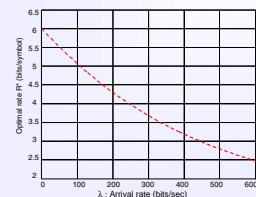
### Problem setup:

- Two queues
- Unlimited buffer size
- Balanced capacities  $C_1 = C_2$



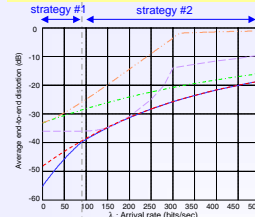
### Observations:

- Fixed  $R$  case:
  - One queue carries as much traffic it can handle. The rest of traffic is dumped to the other queue.
  - optimal routing helps save one of two queues instead loosing both
- Optimal  $R$  case:
  - $q^* = 0.5$
  - $R^*$  decreases with  $\lambda$



— SDC with 2 queues,  $R=6, q^*$  (ASEF)  
- - SDC with 2 queues,  $R^*, q^*$

## DDC Results

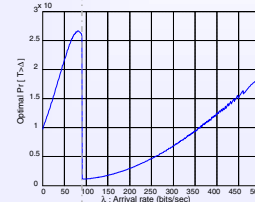
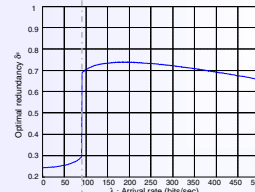
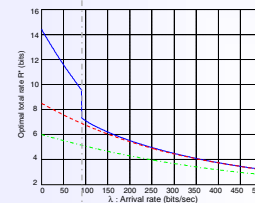


### Problem setup:

- Two queues
- Unlimited buffer size
- Balanced capacities  $C_1 = C_2 = 1000$  bits/s
- Exponential packet length
- $R = R_1 + R_2$
- $\lambda_1 = \lambda_2 = \lambda$

### Observations:

- $R_1^* = R_2^*$
- $\delta_1^* = \delta_2^*$
- $q^* = 0, q^* = 0$
- $R^*$  decreases with arrival rate  $\lambda$
- 2 strategies for  $R$ -optimal DDC
  - strategy #1:** long packets  $\rightarrow$  high delay probability (both packets less likely to arrive)  $\rightarrow$  low encoder redundancy
  - strategy #2:** shorter packets  $\rightarrow$  low delay probability (both packets likely to arrive)  $\rightarrow$  high redundancy
- DDC outperforms SDC under similar conditions



— SDC with two queues and optimal R  
- - SDC with single queue and optimal R  
— DDC with two queues and optimal R  
- - DDC with two queues and Pr[>Delta] from [ASEF]  
- - SDC with two queues and Pr[>Delta] from [ASEF]

[ASEF] M. Alasti, K. Sayrafiyan-Pour, A. Ephremides, N. Farvardin, "Multiple Description Coding in Networks with Congestion Problem," *IEEE Transaction on Information Theory*, Vol. 47, No. 3, March 2001

## Concluding Remarks

### Interesting Observation:

- Known queuing theory result: *splitting the capacity between 2 links can only increase the delay and in our case increase the distortion.*
- Known information theoretic result: *MDC does not reduce the distortion compared to SDC.*
- Our result: *For a delay-sensitive source combining parallel routing and MDC in an optimal way can result in less distortion than an optimal SDC system with a single queue.*
- For a general memory-less source, explicit inner and outer bounds for the multiple description rate-distortion region have been found by Zamir. These bounds maintain the form of the distortion functions we discussed and so we expect our analysis to be applicable for any memory-less source.