

# An Algebraic Approach to Network Coding

July 30–31, 2009

# Outline

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

- 1 Introduction
- 2 Mathitizing a Network
- 3 Linear Coding
- 4 Conclusion

# Digital Communication

Network  
Coding

Digital communication networks are integral parts of our lives these days; so, we want to know how to most effectively use these networks.

Introduction

Mathitizing

Coding

Conclusion

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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- How do we send as much data as possible through the network.

# Digital Communication

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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Two questions quickly arise when considering how to do this:

- What if an error occurs when transmitting data?
- How do we send as much data as possible through the network.

We will be focusing on the latter of these two questions.

# Network Coding

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

Traditionally, the method of choice for transmitting data at a node has been routing. In this method, data recieved at a node is simply re-transmitted (selectively) by the node.

# Network Coding

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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Network coding is a simple extension of routing that allows for any node in the network to perform operations on its recieved data before it transmits any data.

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

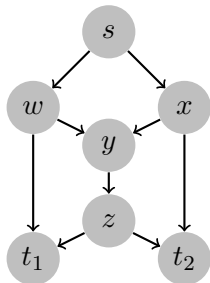
Traditionally, the method of choice for transmitting data at a node has been routing. In this method, data recieved at a node is simply re-transmitted (selectively) by the node.

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Throughout this discussion, we will be considering “delay-free” networks.

# An Example: The Butterfly Network

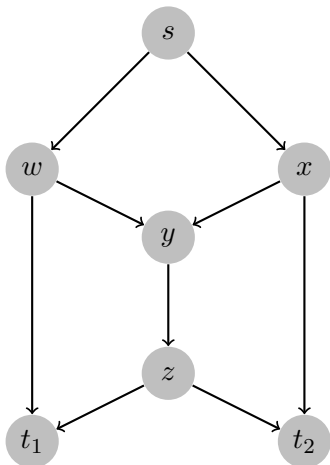
In the network below, we want to get two separate messages from the source node  $s$  to each of the sink nodes  $t_1$  and  $t_2$ .



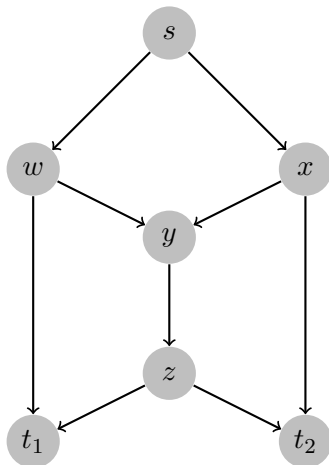
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Network  
Coding

With Routing



With Network Coding



Introduction

Mathitizing

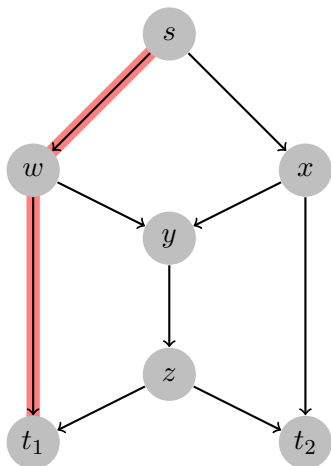
Coding

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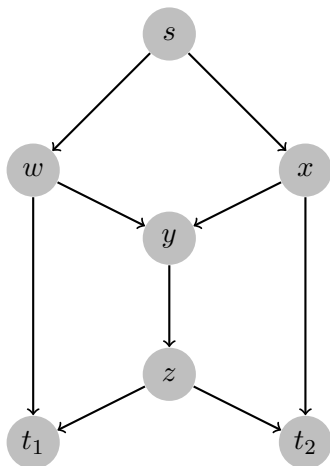
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Network  
Coding

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With Network Coding



Introduction

Mathitizing

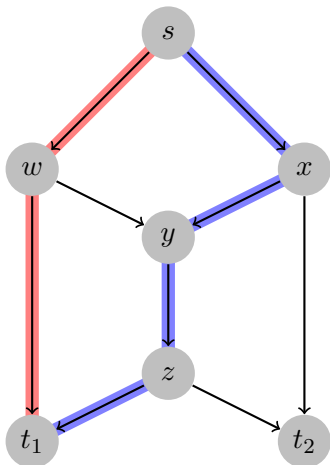
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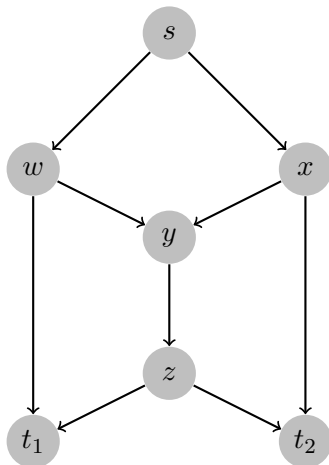
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Network  
Coding

With Routing



With Network Coding



Introduction

Mathitizing

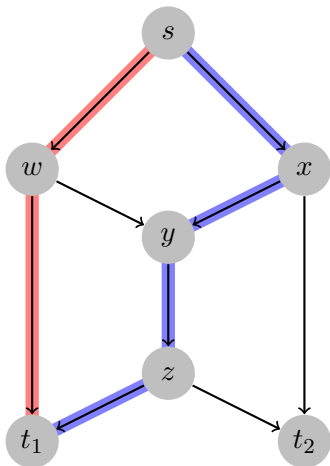
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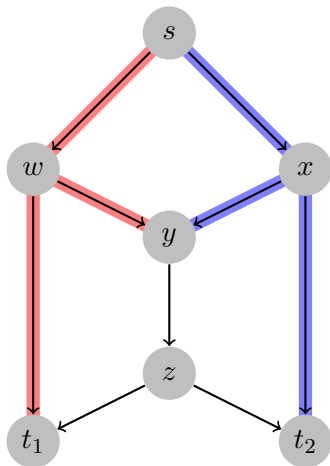
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Network  
Coding

With Routing



With Network Coding



Introduction

Mathitizing

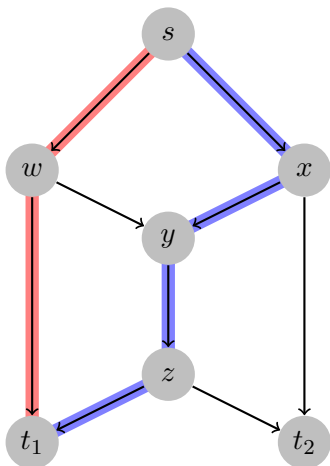
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Conclusion

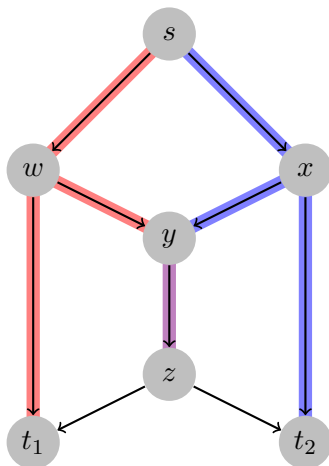
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Network  
Coding

With Routing



With Network Coding



Introduction

Mathitizing

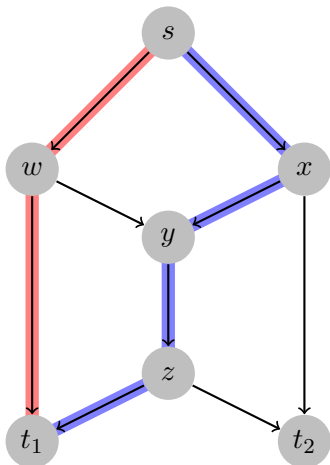
Coding

Conclusion

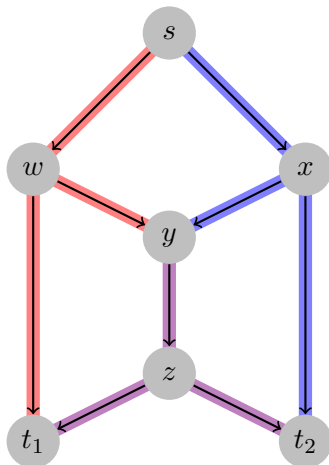
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Network  
Coding

With Routing



With Network Coding



Introduction

Mathitizing

Coding

Conclusion

# Outline

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

① Introduction

② Mathitizing a Network

③ Linear Coding

④ Conclusion

# Some Definitions

For the purposes of this presentation, we will define a communication network to be a directed graph.

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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## Definition

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**Note:** The set  $E$  is a subset of  $V \times V \times \mathbb{N}$  to allow for multiple edges between any two vertices. When no confusion can arise, we will denote an edge as an ordered pair in  $V \times V$ .

# A Simple Example

Network  
Coding

Let  $\mathcal{G} = (V, E)$  be a directed graph with  $V$  and  $E$  given as follows:

$$V = \{a, b, c\}$$

$$E = \{(a, b, 1), (a, b, 2), (a, c, 1), (c, b, 1)\}$$

Introduction

Mathitizing

Coding

Conclusion

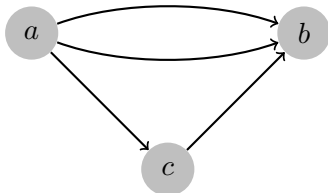
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Then we can visualize  $\mathcal{G}$  as the following figure:



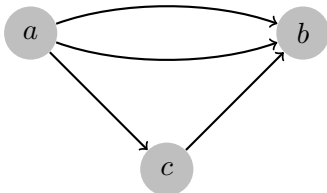
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# Some Notation

- **From here on out,  $\mathcal{G} = (V, E)$  will represent a directed graph.**

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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- For an edge  $e = (v, u, i) \in E$ , we call  $u$  and  $v$  the head and tail of  $e$ , respectively, and we use the notation  $\text{head}(e) = u$  and  $\text{tail}(e) = v$ .

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- For a vertex  $v \in V$ , we define the sets

$$\Gamma_I(v) := \{e \in E \mid \text{head}(e) = v\} \quad \text{and}$$
$$\Gamma_O(v) := \{e \in E \mid \text{tail}(e) = v\}.$$

We define the in-degree and out-degree of  $v$  to be  $\delta_I(v) := |\Gamma_I(v)|$  and  $\delta_O(v) := |\Gamma_O(v)|$ , respectively.

# Modeling Data

We will model the data transmitted through a network as a collection of random processes.

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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- For each  $v \in V$ , we let  $\mathcal{X}(v) = \{X(v, 1), \dots, X(v, \mu(v))\}$  denote a collection of random processes that are observable at the node  $v$ . Here,  $\mu(v)$  is allowed to equal zero, in which case the collection  $\mathcal{X}(v)$  is empty.

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- With each edge  $e \in E$  we will associate a random process  $Y(e)$ . This random process models the data transmitted over the link  $e$ .

# Transmitting Data

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

We will assume that communication in our network is performed by transmission of vectors of bits, that is, as elements of  $\{0, 1\}^m$  for some  $m \in \mathbb{N}$ . Unless otherwise stated, a vector is assumed to be a row vector.

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The above assumption allows for the following:

- We can interpret any random process  $R$  as a discrete random process  $R = \{R_0, R_1, R_2, \dots\}$ .

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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The above assumption allows for the following:

- We can interpret any random process  $R$  as a discrete random process  $R = \{R_0, R_1, R_2, \dots\}$ .
- The data that we are working with, binary  $m$ -tuples, can now be interpreted as elements of  $\mathbb{F}_2^m$ . This has the benefit of using the operations of  $\mathbb{F}_2^m$  on our “packets” of data.

# Will the definitions ever end?

## Definition

- A cycle in  $\mathcal{G}$  is a sequence of edges of the form  $\{(v_0, v_1), (v_1, v_2), \dots, (v_n, v_0)\}$ .

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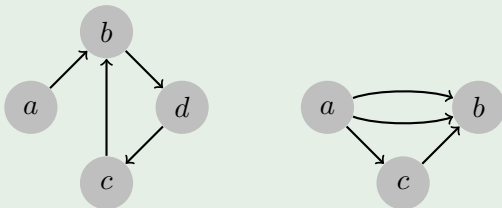
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## Example



# They have to end eventually...

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

## Definition

- A connection in  $\mathcal{G}$  is a triple  $(v, v', \mathcal{X}(v, v')) \in V \times V \times \mathcal{P}_{\mathcal{X}(v)}$ , where  $\mathcal{P}_{\mathcal{X}(v)}$  denotes the power set of  $\mathcal{X}(v)$ .

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- Given a connection  $c = (v, v', \mathcal{X}(v, v'))$ , we call  $v$  the source of  $c$  and  $v'$  the sink of  $c$ . We will denote the source and sink of  $c$  by  $\text{source}(c)$  and  $\text{sink}(c)$ , respectively.

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If  $v$  is a sink of any connection  $c$ , the collection of random processes  $\mathcal{Z}(v) = \{Z(v, 1), \dots, Z(v, \nu(v))\}$  denotes the output at  $v$ . These random processes will be functions of the random processes on the edges in  $\Gamma_I(v)$ .

# Outline

Network  
Coding

Introduction

Mathitizing

**Coding**

Conclusion

① Introduction

② Mathitizing a Network

③ **Linear Coding**

④ Conclusion

# $\mathbb{F}_{2^m}$ -Linear Networks

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

## Definition

Let  $\mathcal{G} = (V, e)$  be a delay-free communication network. We say that  $\mathcal{G}$  is an  $\mathbb{F}_{2^m}$ -linear network if for all links  $e = (v, u, i) \in E$  the random process  $Y(e)$  on  $e$  satisfies

$$Y(e) = \sum_{k=1}^{\mu(v)} \alpha_{k,e} X(v, k) + \sum_{e': \text{head}(e') = \text{tail}(e)} \beta_{e',e} Y(e')$$

where the coefficients  $\alpha_{k,e}$  and  $\beta_{e',e}$  are elements of  $\mathbb{F}_{2^m}$ .

# Output of a Connection

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

In the case of a linear network, we will be forming the output processes in  $\mathcal{Z}(v)$  as linear combinations of the edges in  $\Gamma_I(v)$ :

$$Z(v, k) = \sum_{e': \text{head}(e')=v} \varepsilon_{e',k} Y(e').$$

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

In the case of a linear network, we will be forming the output processes in  $\mathcal{Z}(v)$  as linear combinations of the edges in  $\Gamma_I(v)$ :

$$Z(v, k) = \sum_{e': \text{head}(e')=v} \varepsilon_{e',k} Y(e').$$

Because all of the operations performed at every node are linear functions, each of the output processes is a linear combination of the input processes. Letting  $\underline{x}$  denote the vector of input processes and  $\underline{z}$  denote the vector of output processes, we find that there is a matrix  $M$ , referred to as a transfer matrix, such that  $\underline{z} = \underline{x}M$ .

# Another Definition

Network  
Coding

## Definition

We define a network coding problem as a pair  $(\mathcal{G}, \mathcal{C})$  where  $\mathcal{G}$  is a network and  $\mathcal{C}$  is a set of desired connections.

Introduction

Mathitizing

Coding

Conclusion

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Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

## Definition

We define a network coding problem as a pair  $(\mathcal{G}, \mathcal{C})$  where  $\mathcal{G}$  is a network and  $\mathcal{C}$  is a set of desired connections.

We wish to give succinct algebraic conditions under which a set of desired connections is feasible. This is equivalent to finding elements  $\alpha_{k,e}$ ,  $\beta_{e',e'}$ , and  $\varepsilon_{e',j}$  in a suitably chosen field  $\mathbb{F}_{2^n}$  such that all desired connections can be established. If a connection is feasible, we call the associated network coding problem solvable and the associated collection of coefficients a solution.

# Outline

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

① Introduction

② Mathitizing a Network

③ Linear Coding

④ Conclusion

# Tomorrow

Network  
Coding

Introduction

Mathitizing

Coding

Conclusion

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- Under what conditions is a given linear network coding problem solvable?
- How can we efficiently find a solution to a given linear network coding problem?
- When does a static solution exist for a network that is subject to link failures?