

Network coding theory via commutative algebra

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Playing “*The Butterfly Lovers*” melody¹

Practical concern with CNC

Long-distance symbol-level synchronization is difficult, e.g.,

- when a symbol b misses the synchronization by a unit time (say, a μs), it becomes bD .

LNC	Acyclic network	Data unit $\in \mathbb{F}$
CNC	Any network	Data unit $\in \mathbb{F}[(D)]$
Abstract generalization	Any network	Data unit \in Some algebraic structure that shares the key property of $\mathbb{F}[(D)]$

Algebraic properties of the ring $\mathbb{F}[(D)]$

Inside the ring $\mathbb{F}[(D)]$, the ideal $\langle D^t \rangle$ represents things that happen from the time t onward.

Key property: All ideals in the ring $\mathbb{F}[(D)]$ form a strictly descending chain

$$\langle D \rangle \supset \langle D^2 \rangle \supset \dots \supset \langle D^t \rangle \supset \dots \rightarrow \{0\}$$

// Anything infinitely delayed is null.

What algebraic structures share this **key property**?

Recall that CNC expands the polynomial ring $\mathbb{F}[D]$ into the ring $\mathbb{F}[(D)]$ of rational power series by **making everything**, except time, **invertible**.

This means **localization** of the ring $\mathbb{F}[D]$ at the ideal $\langle D \rangle$.

Algebraic properties of the ring $\mathbb{F}[(D)]$

Just ignore this slide if it contains foreign language to you. Relax!

$\mathbb{F}[D]$ is a **PID**, and $\langle D \rangle$ is a **prime** ideal.

// In fact, a maximal ideal

Localization results in a **local ring** $\mathbb{F}[(D)]$,
which is also a **PID**.
} A **discrete valuation ring (DVR)**

Terminology. When a **local ring** is a **DVR**, the generator z of the unique maximal ideal is called the **uniformizer**.

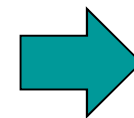
The **key property** of $\mathbb{F}[(D)]$ is typical for a **DVR**:

- All ideals in the DVR form a strictly descending chain

$$\langle z \rangle \supset \langle z^2 \rangle \supset \dots \supset \langle z^t \rangle \supset \dots \rightarrow \{0\}$$

// By, e.g., *Nakayama's Lemma*

// Unidirectional, just like time.



Algebraic structures

	+	−	*	/	Examples	Remarks
Field \mathbb{F}	✓	✓	✓	✓	$\mathbb{Q} = \{\text{rational \#s}\},$ $\mathbb{R} = \{\text{real \#s}\},$ $\mathbb{F}(x) =$ $\{\text{rational functions}\}$	
Ring (commutative ring with id)	✓	✓	✓	✗	$\mathbb{R} \times \mathbb{R},$ $\mathbb{Z} = \{\text{integers}\}$	Zero divisor: $(2, 0) * (0, 5) = (0, 0)$

Ideals in a ring

- In a ring \mathbb{R} , the ideal generated by element a is

$$\{ax : x \in \mathbb{R}\} = \langle a \rangle = a \cdot \mathbb{R}$$

- Thus, $\langle a \rangle \supset \langle b \rangle$ means that $a \mid b$.

// Then, a/b makes sense when \mathbb{R} is an integral domain.

- The ideal generated by elements a, b, c is

$$\{ax+by+cz : x, y, z \in \mathbb{R}\} = \langle a, b, c \rangle$$

- The ring $\mathbb{F}[[D]] = \{\text{symbol pipelines starting at a time } \geq 0\}$.

The ideal $D^3 \cdot \mathbb{F}[[D]] = \{\text{symbol pipelines starting at a time } \geq 3\}$.

- The ring $\mathbb{F}[(D)] = \{\text{“rational pipelines” starting at a time } \geq 0\}$.

The ideal $D \cdot \mathbb{F}[(D)] = \{\text{“rational pipelines” starting at a time } \geq 1\}$.

Ring, field, integral domain, & PID

	+−*	/	Examples	Remarks
Ring (commutative ring with id)	✓	✗	$\mathbb{R} \times \mathbb{R}$	Zero = (0, 0). \exists zero divisor, which is not invertible: $(2, 0) * (0, 5) = \text{zero}$
Integral domain	✓	✗ _✓	$\mathbb{Z}[x]$	\exists non-principal ideal: $\langle 2, x \rangle \neq \langle \text{any} \rangle$
Principal ideal domain (PID) \mathbb{P}	✓	✗ _✓	$\mathbb{Z}, \mathbb{F}[x]$	Ideal \leftrightarrow element up to invertible factor. Good enough for basic linear algebra. Ordering among ideals via inclusion is partial.
Discrete valuation ring (DVR) \mathbb{D}	✓	✗ _✓	$\mathbb{F}[(D)],$ $\mathbb{F}[[D]]$	All ideals form a linear chain.
Field \mathbb{F}	✓	✓	$\mathbb{Q}, \mathbb{R},$ $\mathbb{F}(x)$	The only ideal is $\{0\}$.

Synchronization concern \rightarrow general DVR

Long-distance symbol-level synchronization is difficult, e.g.,

- when a symbol b misses the synchronization by a unit time (say, a μs), it becomes bD .

LNC	Acyclic network	data unit $\in \mathbb{F}$
CNC	Any network	data unit $\in \mathbb{F}[(D)]$
Abstract NC	Any network	data unit $\in \mathbb{D}$, a DVR

Generality enhances applicability.

A DVR is not restricted to time-multiplexing of data symbols.

Example. When the uniformizer z of a DVR represents a unit shift in **any domain other than time** (e.g., space, phase, frequency, wavelength, or code), then the DVR-based NC is insensitive to imprecision in inter-node synchronization.

Generality. The uniformizer of a DVR is not necessarily a shift in any particular domain.

Open problem. Identify **explicit** application of NV based on a general DVR.

$$\mathbb{F}[(D)] \rightarrow \text{PID} \rightarrow \text{DVR}$$

\mathbb{Z} = A handy
example of PID

$\mathbb{F}[(D)]$
for CNC

DVR

PID suffices for linear algebra

Contents

- **PID-based network coding**
- **DVR-based causal network coding**

Based mainly on:

[Li-Sun, “Network coding theory via commutative algebra,” IEEE Trans. IT., 1/2011]

Contents

- **PID-based network coding**
 - **Non-singular and normal network codes**
 - Existence of optimal code
- DVR-based causal network coding

\mathbb{P} -linear network code

Let \mathbb{P} denote a PID.

Definition. A \mathbb{P} -linear network code assigns a coding coefficient $k_{d,e} \in \mathbb{P}$ to every adjacent pair (d, e) of channels.

Moreover, a \mathbb{P} -linear network code is **normal** if it is associated with a **unique** set of coding vectors f_e .

Normality is crucial for:

- Message propagation — The coding vector f_e unambiguously specifies a data unit $\in \mathbb{P}$ to be transmitted over a channel e .
- Message reception — A node **decodes** by its incoming coding vectors rather than by coding coefficients.

Rules over coding vectors

Terminology. A channel is called an *s-channel* or a *link* depending whether its originating end is the source s .

A set of coding vectors f_e satisfies the following w.r.t. the coding coefficients:

Initialization. Coding vectors of *s-channels* form the natural basis of \mathbb{F}^ω , where ω is the message size. Thus,

$$[f_e]_{e: \textit{s-channel}} = \text{the identity matrix } I_\omega$$

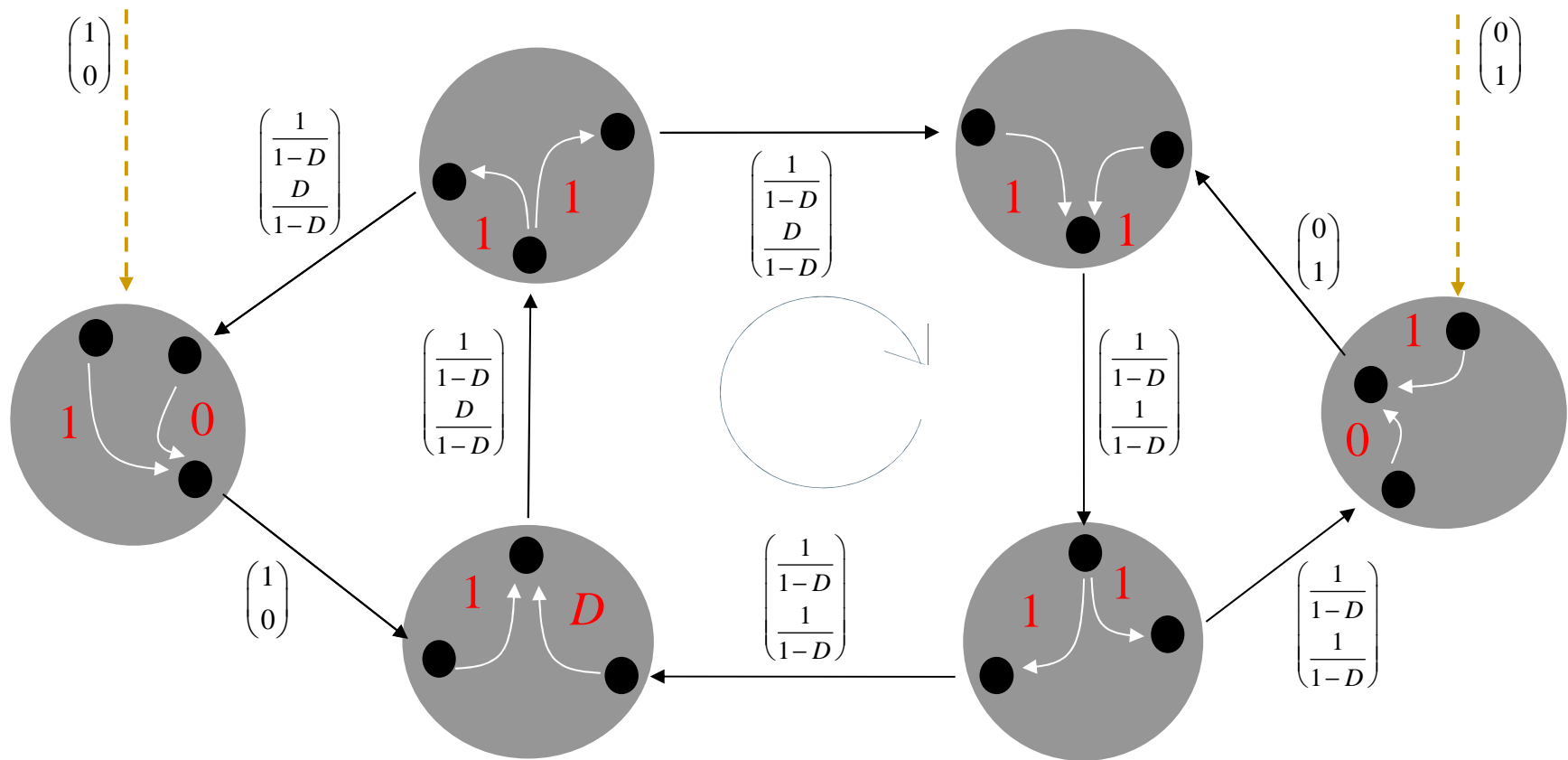
Recursion. For an outgoing *link* e from a node v ($\neq s$),

$$f_e = \sum_{d \in \text{In}(v)} f_d k_{d,e}$$

Example of normal convolutional NC

Initialization. Coding vectors of *s*-channels form the natural basis of \mathbb{P}^ω .

Recursion. For an outgoing link *e* from a node *v*, $f_e = \sum_{d \in \text{In}(v)} f_d k_{d,e}$



Calculation of coding vectors

Initialization. Coding vectors of *s-channels* form the natural basis of \mathbb{P}^ω .

$[f_e]_{e: \textit{s-channel}}$ = the identity matrix I_ω

Recursion. For an outgoing *link* e from a node v , $f_e = \sum_{d \in \text{In}(v)} f_d k_{d,e}$

$$\begin{aligned} f_e &= \sum_{d \in \text{In}(v)} f_d k_{d,e} \\ &= \sum_{\textit{s-channel } d \in \text{In}(v)} f_d k_{d,e} + \sum_{\textit{link } d \in \text{In}(v)} f_d k_{d,e} \end{aligned}$$

$$= \begin{bmatrix} \vdots \\ k_{d,e} \\ \vdots \end{bmatrix}_{d: \textit{s-channel}} + \sum_{\textit{link } d \in \text{In}(v)} f_d k_{d,e}$$

Coding vectors

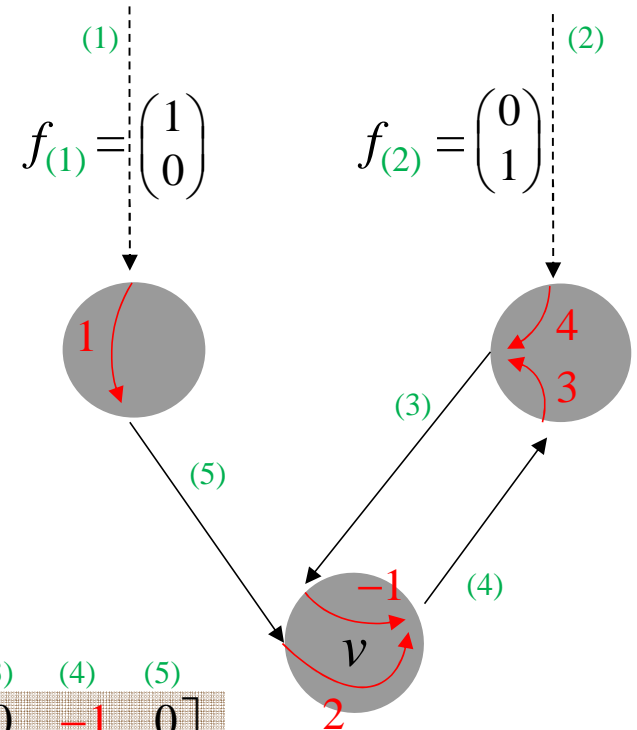
Equation. For an outgoing **link** e from v ,

$$f_e = \begin{bmatrix} \vdots \\ k_{d,e} \\ \vdots \end{bmatrix}_{d: s\text{-channel}} + \sum_{\text{link } d \in \text{In}(v)} f_d k_{d,e}$$

Example. Take $f_e = f_{(3)}, f_{(4)}, f_{(5)}$ together.

$$\begin{bmatrix} f_{(3)} & f_{(4)} & f_{(5)} \end{bmatrix} = \begin{matrix} & \begin{matrix} (3) & (4) & (5) \end{matrix} \\ \begin{matrix} (1) \\ (2) \end{matrix} & \begin{bmatrix} 0 & 0 & 1 \\ 4 & 0 & 0 \end{bmatrix} \end{matrix} + \begin{bmatrix} f_{(3)} & f_{(4)} & f_{(5)} \end{bmatrix} \bullet \begin{matrix} \begin{matrix} (3) \\ (4) \\ (5) \end{matrix} & \begin{bmatrix} 0 & -1 & 0 \\ 3 & 0 & 0 \\ 0 & 2 & 0 \end{bmatrix} \end{matrix}$$

Notation. $F = A + F \bullet B$



Calculation for coding vectors

Try to solve F in terms of A and B from:

$$F = A + F B$$

$$F \cdot (I_l - B) = A \quad // \text{ Write } l \text{ for the number of links.}$$

$$\det(I_l - B) F = A \cdot \text{Adj}(I_l - B) \quad // \text{ Adj = Adjugate matrix}$$

The special case of an **acyclic network:**

The upstream-to-downstream order

$\Rightarrow B$ is a strictly triangular matrix

$\Rightarrow \det(I_l - B) = 1 \quad \& \quad \text{Adj}(I_l - B) = (I_l - B)^{-1}$

\Rightarrow **Unique solution:** $F = A \cdot (I_l - B)^{-1}$

Optimal Linear Network Codes on acyclic network

Definition. An \mathbb{F} -linear network code (\mathbb{F} -LNC) is said to be **optimal** when

- Incoming coding vectors to every receiver v generate a subspace of \mathbb{F}^ω with the full rank ω .

For each receiver v , create ω edge-disjoint paths starting from s -channels and ending at incoming links to v .

// if necessary append a new source node

Notation. Let C_v be an $(|E|-\omega) \times \omega$ index matrix in which

- rows are indexed by links;
- columns are indexed by s -channels;
- the $(e, d)^{\text{th}}$ entry in C_v is 1 when one of the ω paths starts with d and ends with the incoming link e to v and is 0 otherwise.

Existence of Optimal LNC on acyclic network

Corollary. An \mathbb{F} -LNC is optimal if, for each receiver v ,

- the matrix $A \cdot (I - B)^{-1} \cdot C_v$ is nonsingular (and has the full rank ω)
- or, equivalently, the matrix $\begin{bmatrix} A & 0 \\ I - B & C_v \end{bmatrix}$ is nonsingular.

I_ω	$-A(I - B)^{-1}$
0	$(I - B)^{-1}$

A	0
$I - B$	C_v

 $=$

0	$A \cdot (I - B)^{-1} \cdot C_v$
I	$(I - B)^{-1} \cdot C_v$

Existence of Optimal LNC on acyclic network

Lemma. If $|\mathbb{F}|$ exceeds the degree of every x_i in a polynomial $g(x_1, \dots, x_n)$ over \mathbb{F} , then there exist $a_1, \dots, a_n \in \mathbb{F}$ such that $g(a_1, \dots, a_n) \neq 0$.

Proof. By induction on n .

Theorem 1. An optimal \mathbb{F} -LNC exists when $|\mathbb{F}| > \delta$ ($=$ number of receivers).

Proof. Regard every coding coefficient $k_{d,e}$ as an indeterminate. The degree of every indeterminate is at most 1 in $\det \begin{bmatrix} A & 0 \\ I-B & C_v \end{bmatrix}$ for every v and hence at most δ in $\prod_{v: \text{receiver}} \begin{bmatrix} A & 0 \\ I-B & C_v \end{bmatrix}$. The above Lemma now applies. ■

Task. Fill matrices A and B with coding coefficient $k_{d,e}$ and achieve nonsingularity of the δ matrices $\begin{bmatrix} A & 0 \\ I-B & C_v \end{bmatrix}$.

Schwartz-Zippel Lemma and an extension

Schwartz-Zippel Lemma. Let $g(x_1, \dots, x_n)$ be a polynomial of degree $\delta > 0$ over \mathbb{F} , and a_1, \dots, a_n be independently and uniformly selected scalars from $F \subseteq \mathbb{F}$. Then,

$$\Pr\{g(a_1, \dots, a_n) = 0\} \leq \delta / |F|$$

Proof. By induction on n .

$$// \Pr\{g(a_1, \dots, a_n) \neq 0\} \geq 1 - \delta / |F|$$

Extension. Consider a polynomial $g(x_1, \dots, x_n)$ of a total degree δm over \mathbb{F} such that the degree of each indeterminate is no more than δ . Let a_1, \dots, a_n be independently and uniformly selected scalars from $F \subseteq \mathbb{F}$. Then,

$$\Pr\{g(a_1, \dots, a_n) \neq 0\} \geq (1 - \delta / |F|)^m$$

Proof. Refer to Lemma 4 in [Ho *et al.*, “A random linear network coding approach to multicast”].

Optimality of Random LNCs

Theorem. Let $|\mathbb{F}| > \delta$. Construct an \mathbb{F} -LNC with coding coefficients independently and uniformly chosen from \mathbb{F} . Then, the probability for the \mathbb{F} -LNC to be optimal is at least $(1 - \delta/|\mathbb{F}|)^{|E|}$.

Proof. In the extended lemma, let $g(x_1, \dots, x_n) = \prod_{v: \text{receiver}} \begin{bmatrix} A & 0 \\ I-B & C_v \end{bmatrix}$
and $m = |E|$. ■

Nonsingularity and normality

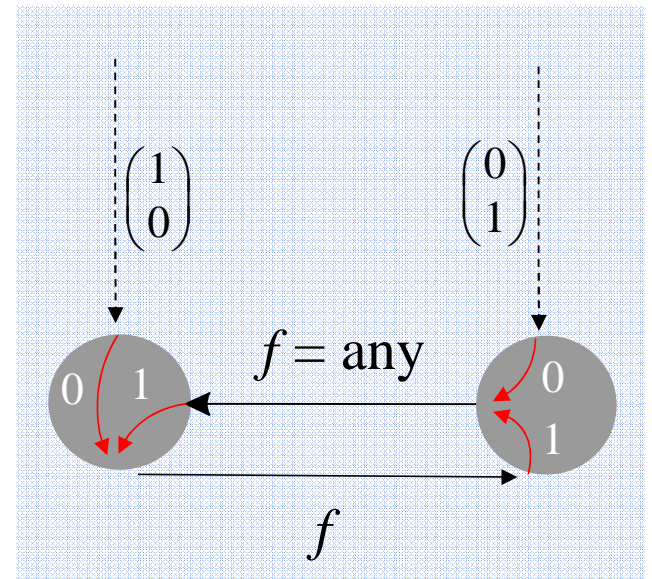
For a \mathbb{P} -linear network code, $\det(I_l - B) \neq 0 \iff F = A \cdot \text{Adj}(I_l - B)$

$$\det(I_l - B) = 0$$

None or multiple
solutions for $[f_e]_{e \in E}$

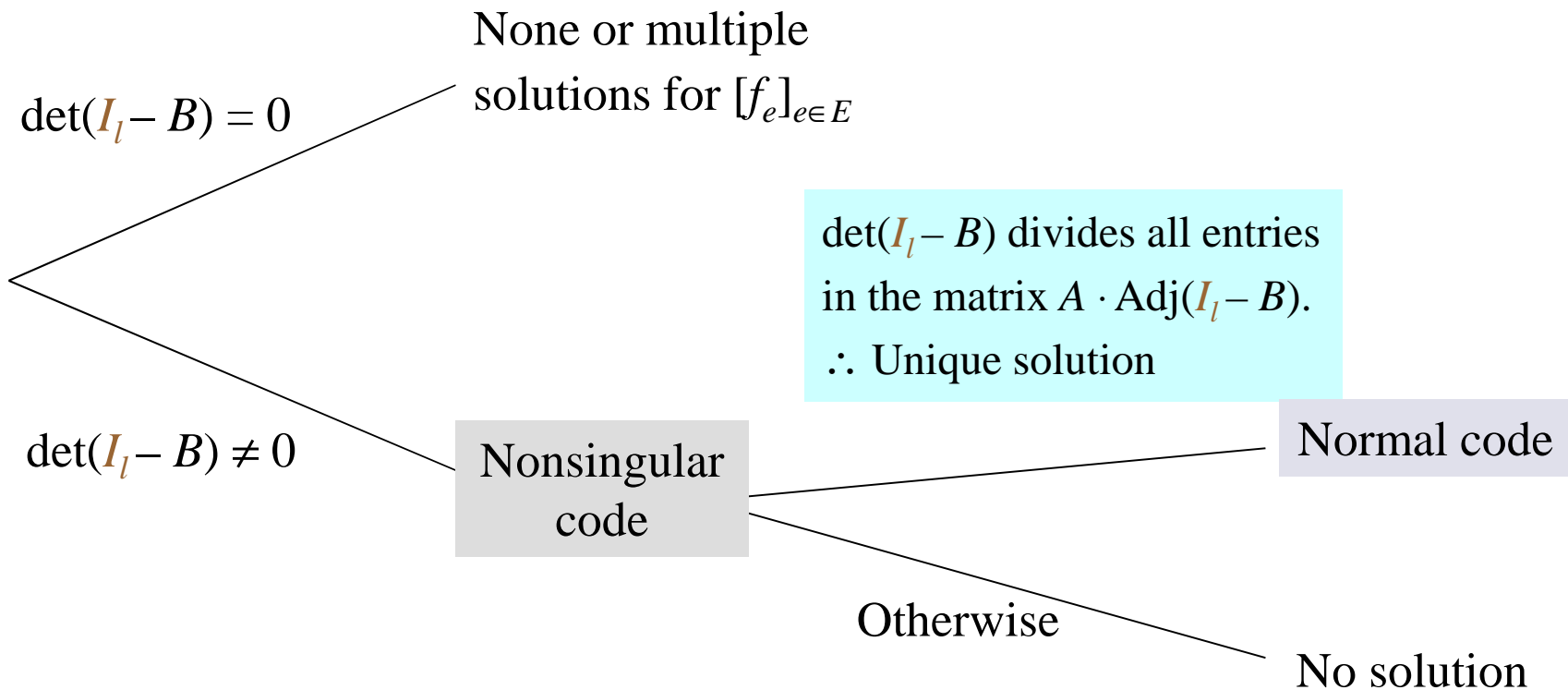
$$\det(I_l - B) \neq 0$$

Nonsingular
code



Nonsingularity and normality

For a \mathbb{P} -linear network code, $\det(I_l - B) \nmid F = A \cdot \text{Adj}(I_l - B)$



Nonsingularity $\not\Rightarrow$ normality over \mathbb{P}

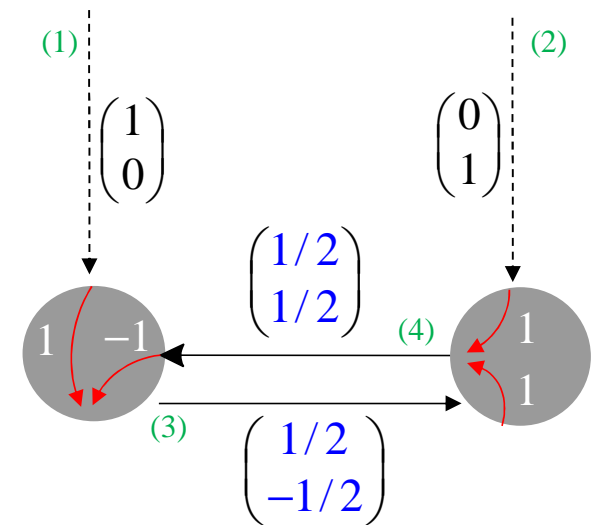
Example. $\mathbb{P} = \mathbb{Z}$, $A = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$, $B = \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix}$, $l = 2$

$$\therefore I_l - B = \begin{bmatrix} 1 & 1 \\ -1 & 1 \end{bmatrix} \text{ and } \text{Adj}(I_l - B) = \begin{bmatrix} 1 & -1 \\ 1 & 1 \end{bmatrix}$$

This \mathbb{Z} -linear network code is nonsingular because $\det(I_l - B) = 2 \neq 0$.

But, it is **not** normal as 2 does not divide

entries in $A \cdot \text{Adj}(I_l - B) = \begin{bmatrix} 1 & -1 \\ 1 & 1 \end{bmatrix}$



“Coding vectors” exist over \mathbb{Q} , the quotient field of \mathbb{Z} .

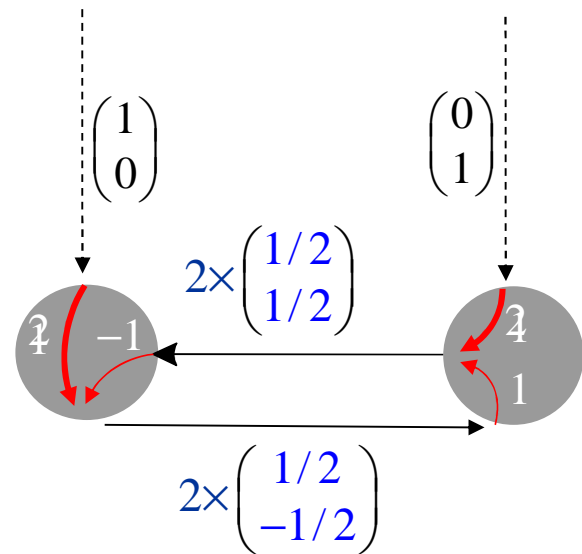
Normalization of a nonsingular code

When $\det(I_l - B) \neq 0$, we can force it to be a divisor of all entries in the matrix $A \cdot \text{Adj}(I_l - B)$ by:

// A contains $k_{d,e}$ with s -channel d .

- Simply multiply every entry in A with $\det(I_l - B)$.

$$\det(I_l - B) = 2$$



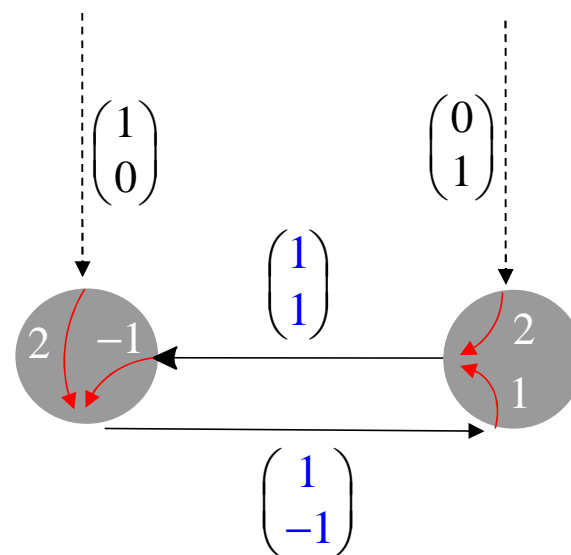
“Coding vectors” exist over \mathbb{Q} , the quotient field of \mathbb{Z} .

Normalization of a nonsingular code

When $\det(I_l - B) \neq 0$, we can force it to be a divisor of all entries in the matrix $A \cdot \text{Adj}(I_l - B)$ by:

// A contains $k_{d,e}$ with s -channel d .

- Simply multiply every entry in A with $\det(I_l - B)$.



The nonsingular code becomes normal.

Coding vectors now exist over \mathbb{Z} .

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- **PID-based network coding**
 - Non-singular and normal network codes
 - **Existence of optimal code**
- DVR-based causal network coding

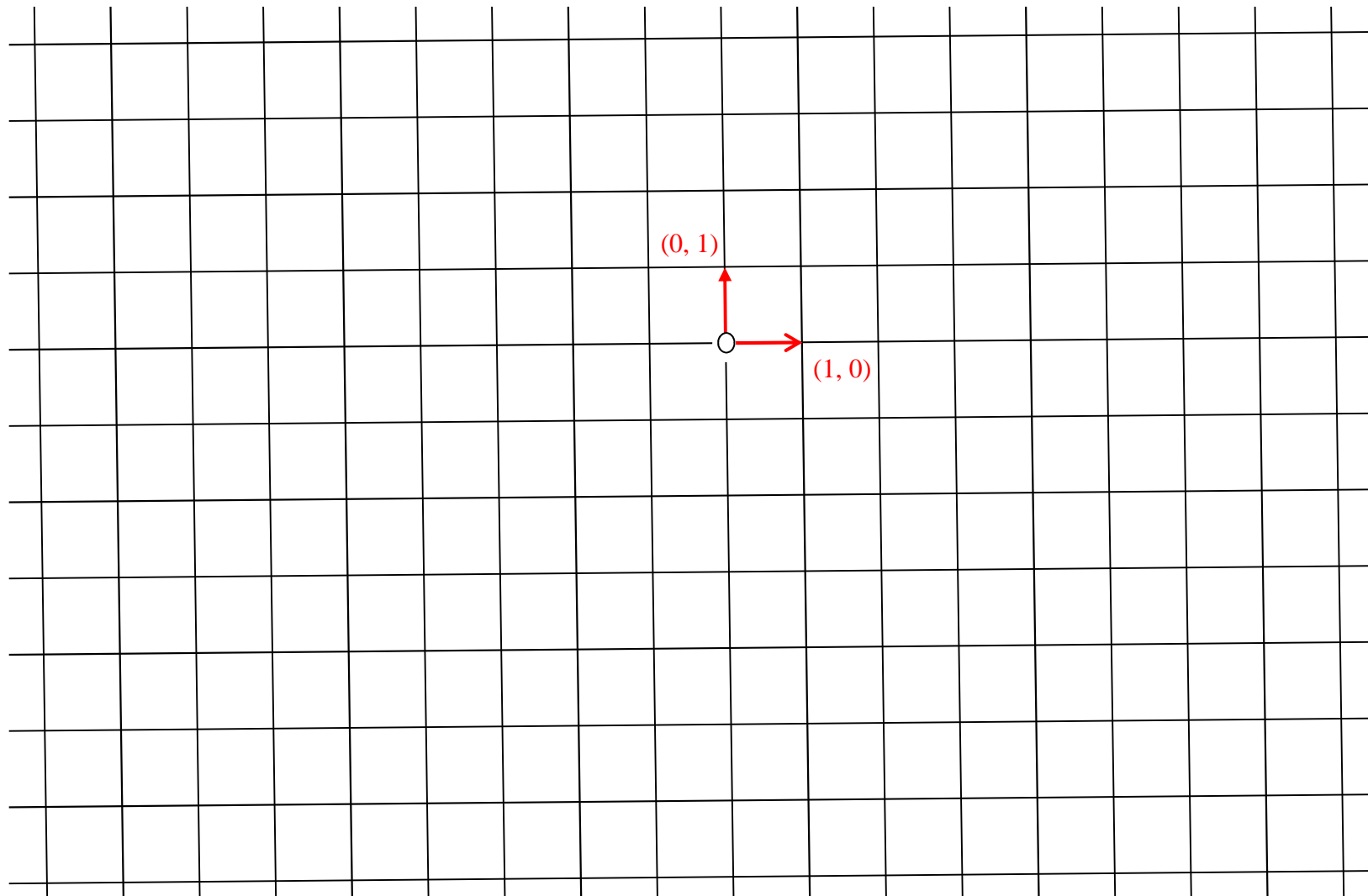
Inv. Factor Thm. of Free Submodule over a PID

By Invariant Factor Theorem of Free Submodule over a PID, every submodule of \mathbb{P}^ω is a free module over \mathbb{P} . // Free \Rightarrow It has a rank $\leq \omega$.

We now illustrate this theorem with $\mathbb{P} = \mathbb{Z}$.

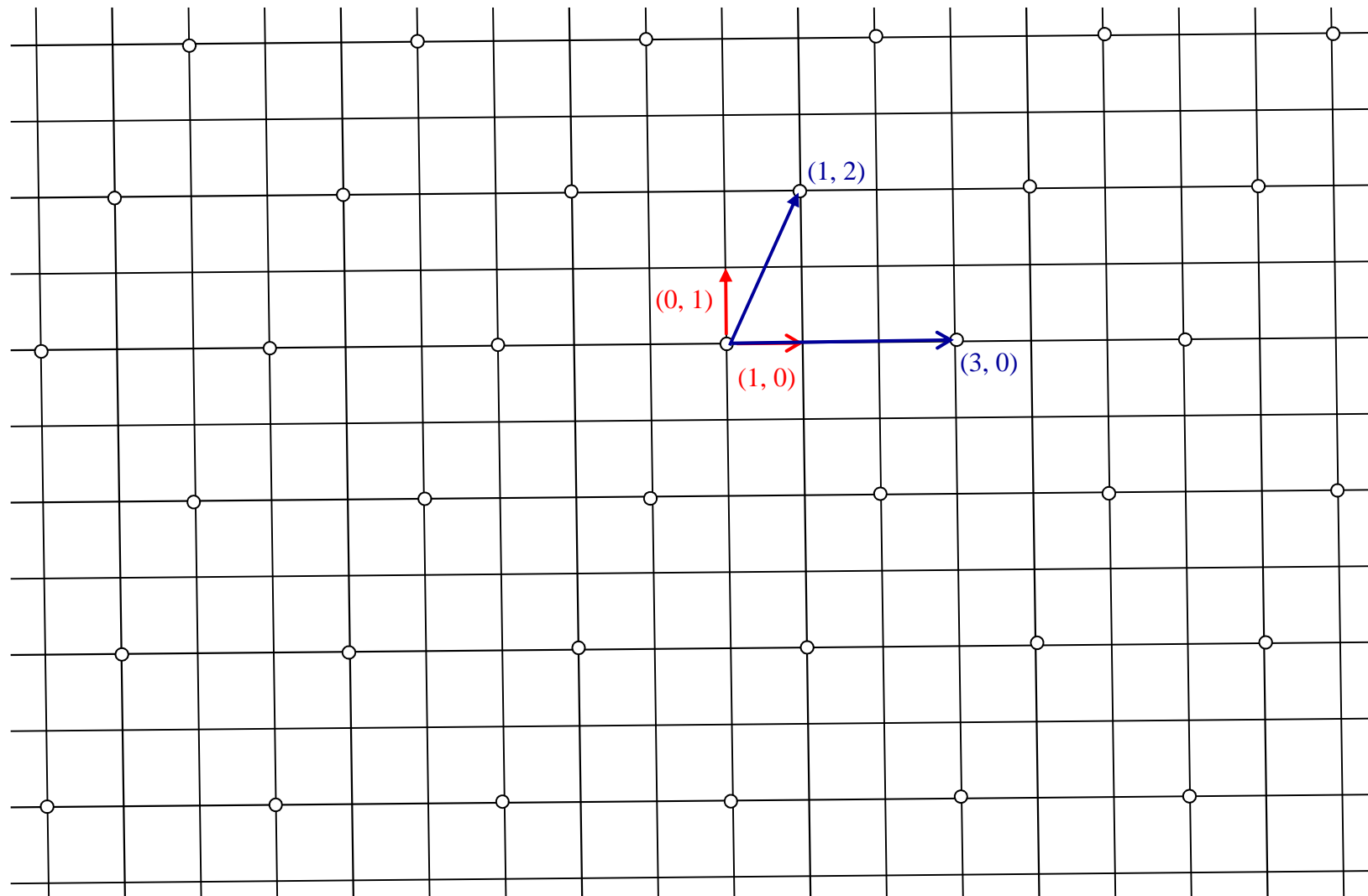
Inv. Factor Thm. of Free Submodule over a PID ($= \mathbb{Z}$)

Lattice points on the grid $= \mathbb{Z}^2$, a free \mathbb{Z} -module at the rank 2.



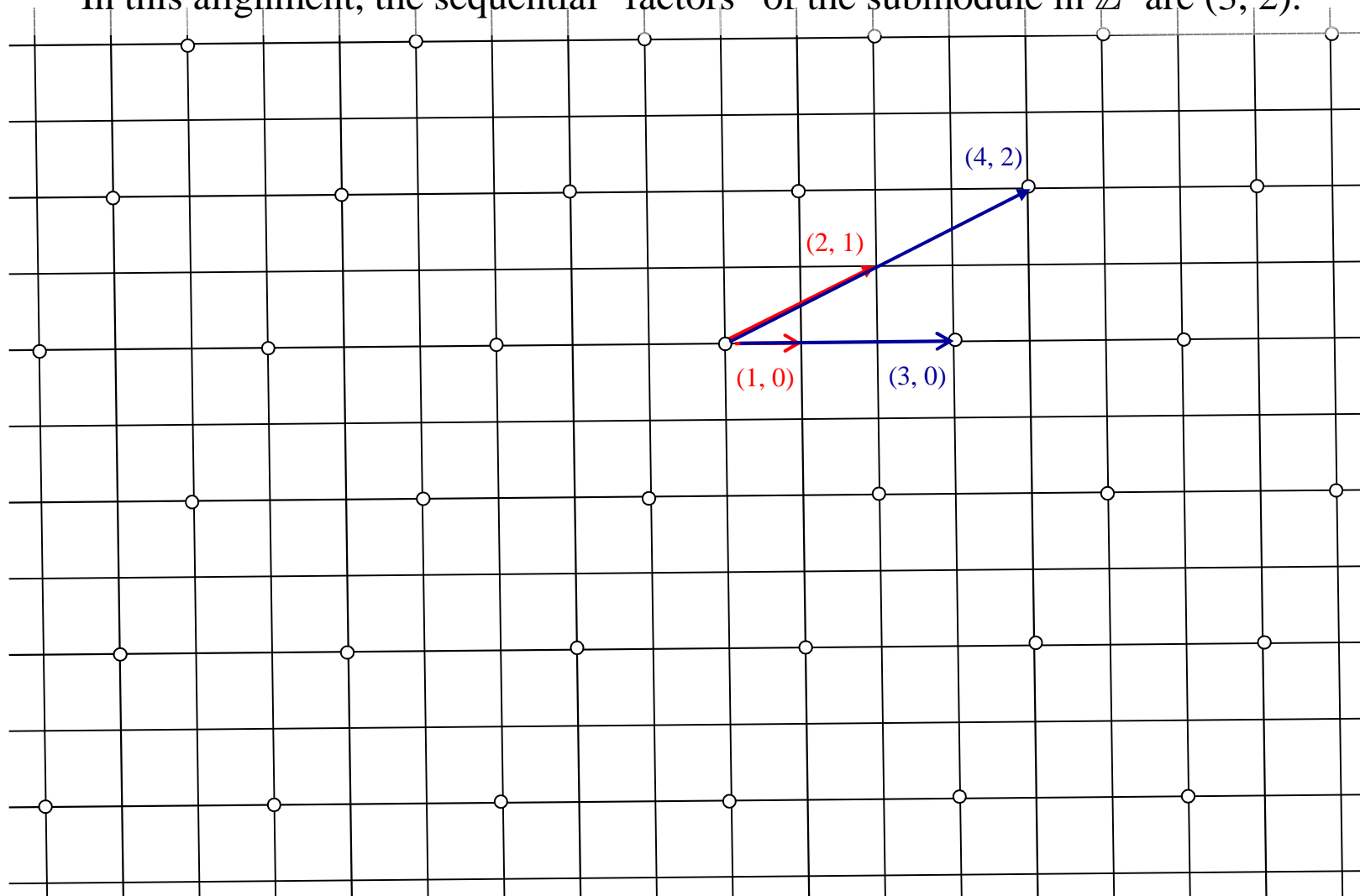
A submodule of a free \mathbb{Z} -module is automatically free.

The exemplifying submodule is at the rank 2 with a basis as shown.



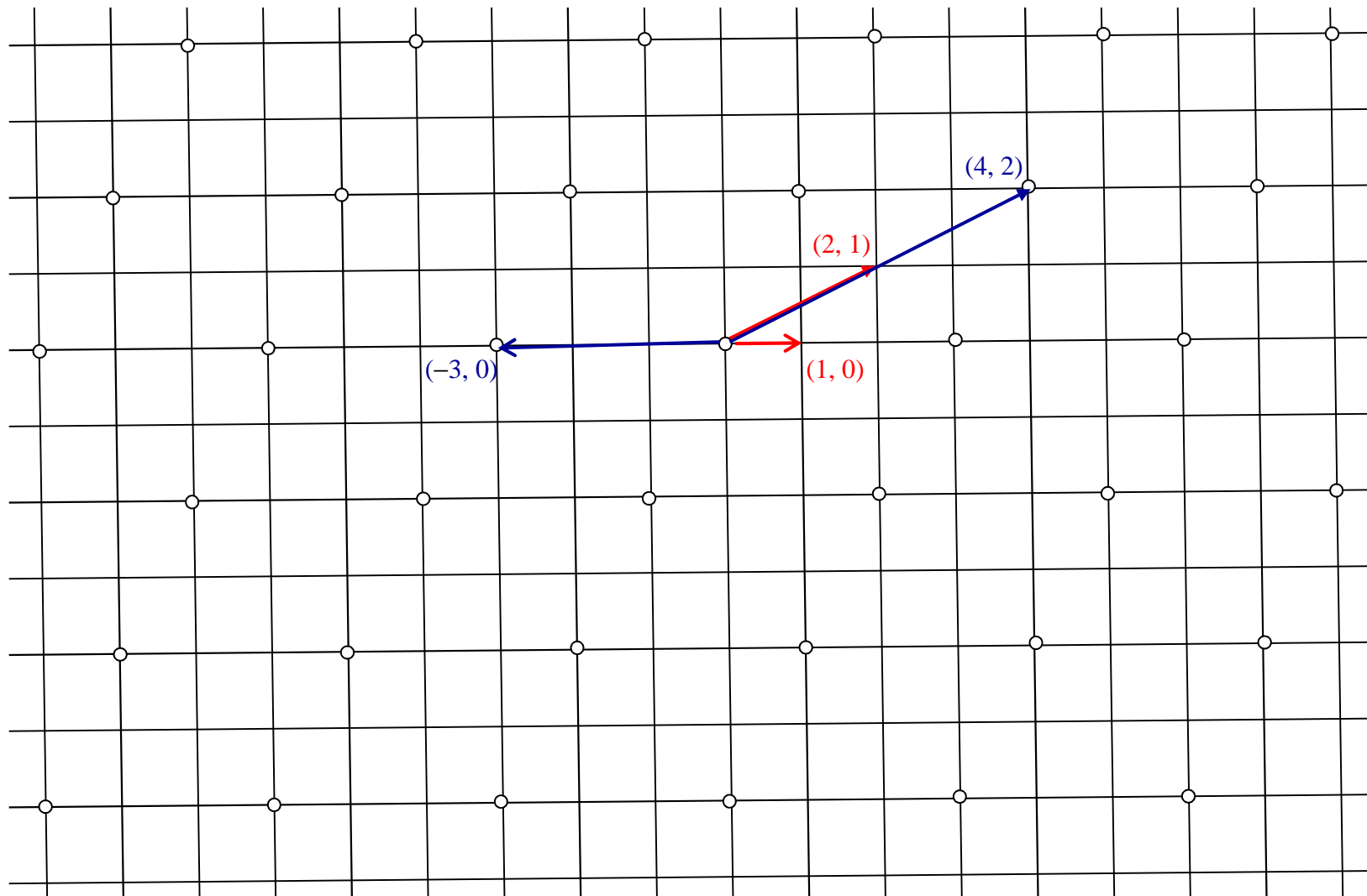
**PID \Rightarrow The submodule is also free,
and the bases of can be aligned.**

In this alignment, the sequential “factors” of the submodule in \mathbb{Z}^2 are $(3, 2)$.



Another way to align the two bases

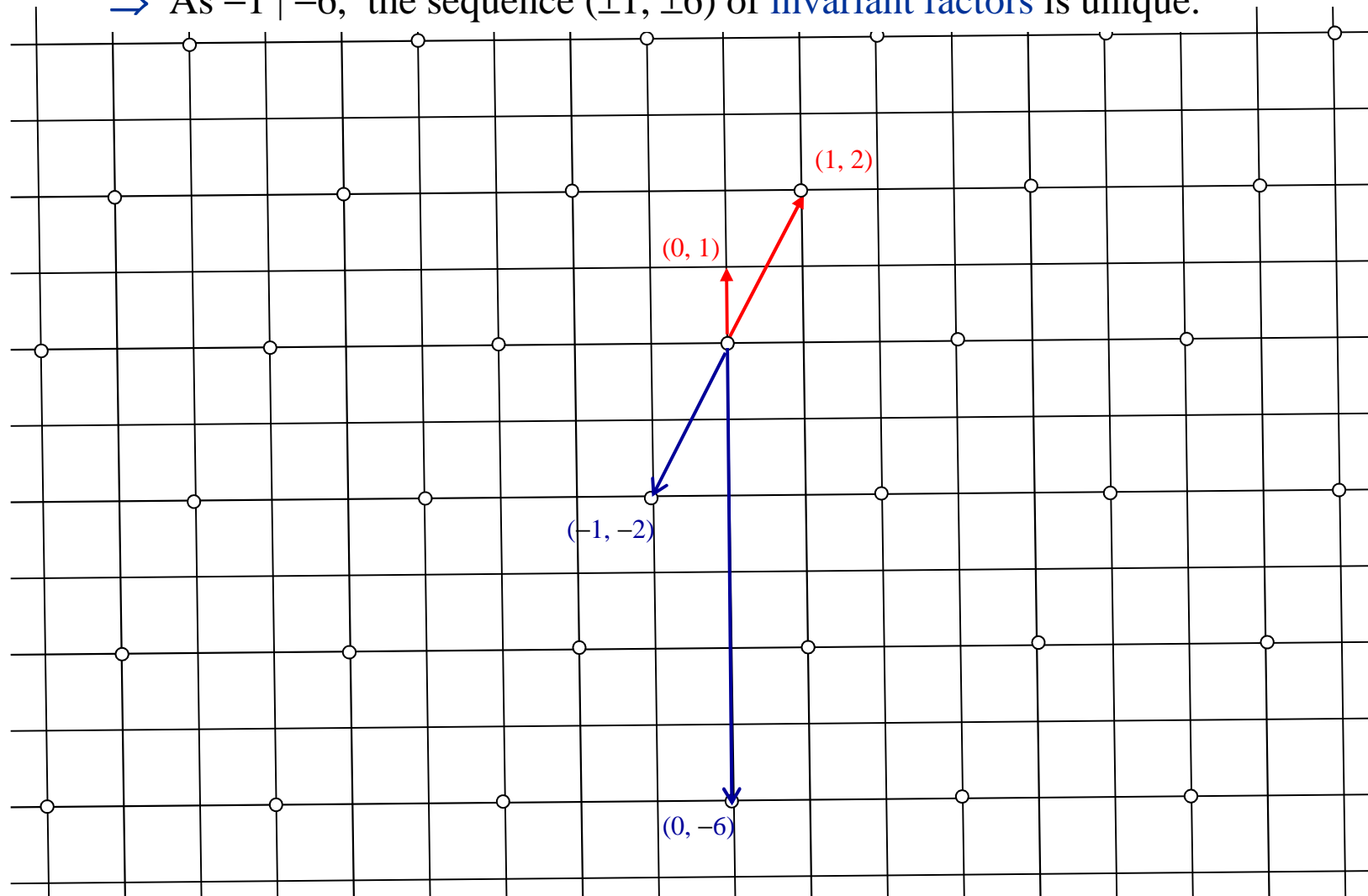
The sequential “factors” of the submodule in \mathbb{Z}^2 now become $(-3, 2)$.



PID \Rightarrow Can so align that “factors” divide one another

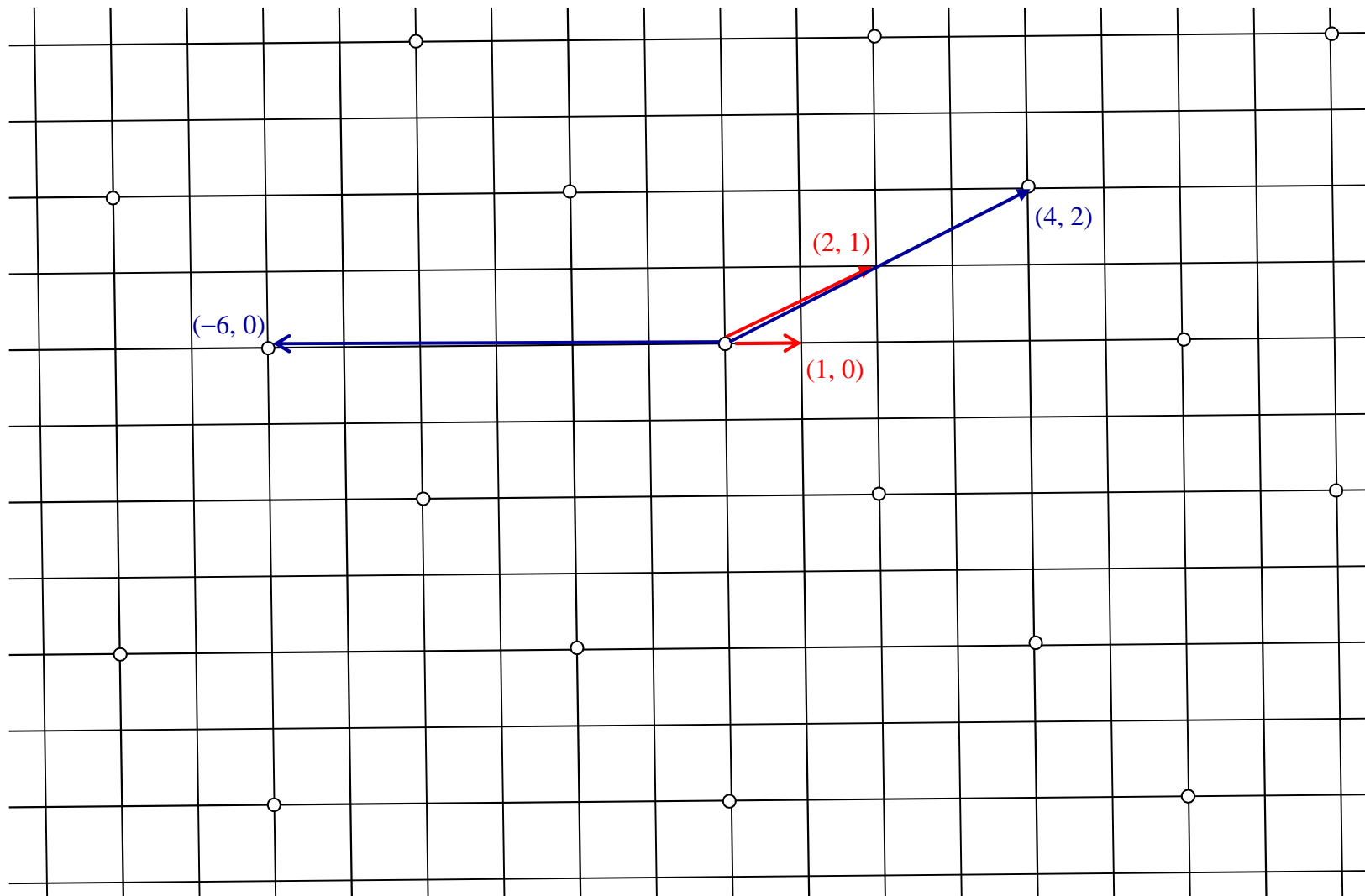
The sequential “factors” of the submodule in \mathbb{Z}^2 now become $(-1, -6)$.

\Rightarrow As $-1 \mid -6$, the sequence $(\pm 1, \pm 6)$ of **invariant factors** is unique.



A smaller submodule at the rank 2

The **invariant factors** of this smaller submodule in \mathbb{Z}^2 are $(\pm 2, \pm 6)$.



\mathbb{P} -linear network code with optimal data reception

Let f_e be coding vectors of a normal \mathbb{P} -linear network code.

By **Invariant Factor Theorem of Free Submodule over a PID**, incoming coding vectors to a node v generate a free submodule of \mathbb{P}^ω . The **rank** of this submodule is the **data reception rate** of v .

Definition. A **normal** \mathbb{P} -linear network code is said to be **optimal** when

- The **data reception rate** of every node $v = \text{maxflow}$ from s to v .

Existence of optimal \mathbb{P} -linear NC

Theorem 1. There exists an optimal \mathbb{P} -linear NC when $|\mathbb{P}|$ is sufficiently large.

Proof. The fundamental theorem of LNC asserts the existence of an optimal \mathbb{F} -linear NC with all coding coefficients in any sufficiently large subset of \mathbb{F} .

So we may assume that \mathbb{P} is *not* a field and hence is an infinite PID.

Applying the Lemma 1 to $\mathbb{F} = \text{quotient field of } \mathbb{P}$, there exists

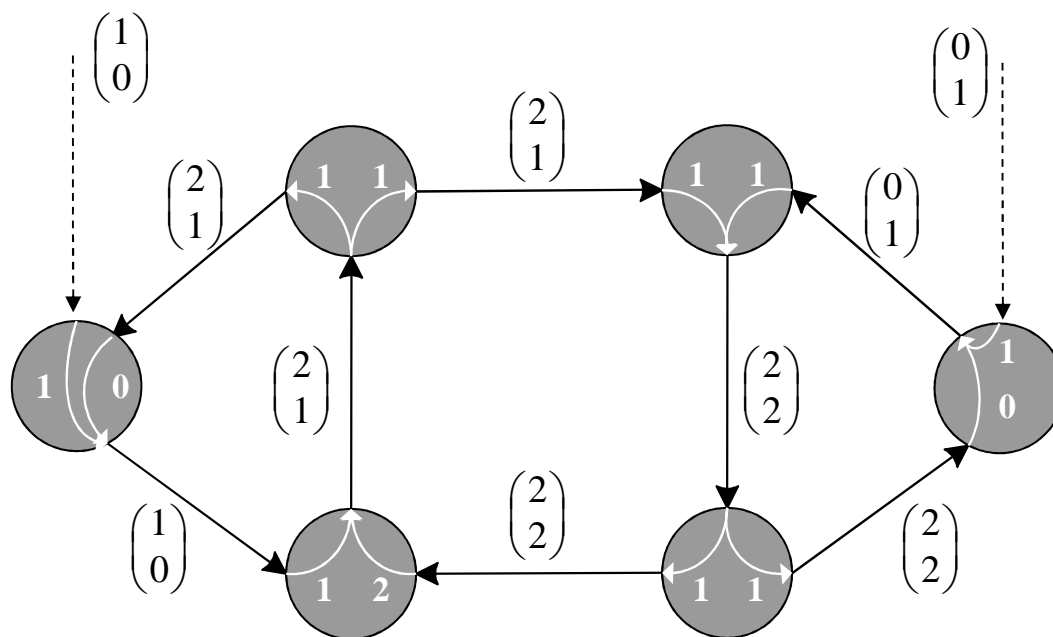
- an optimal \mathbb{F} -linear NC with coding coefficients in \mathbb{P} .

This NC qualifies as

- a nonsingular \mathbb{P} -linear network code.

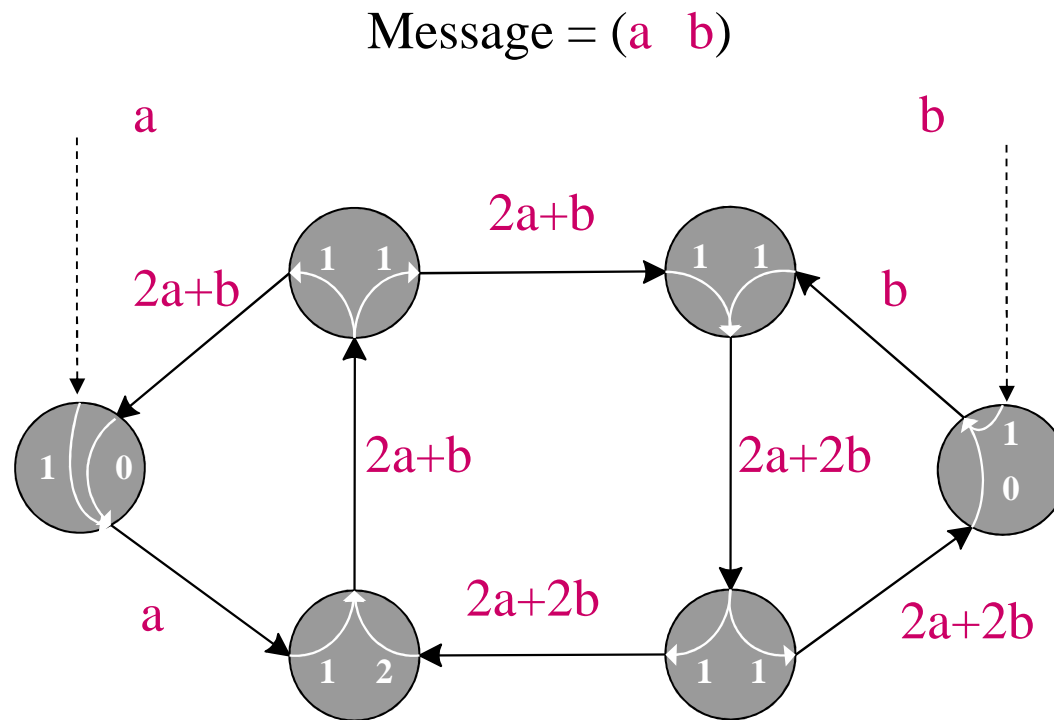
Normalize the code into an optimal \mathbb{P} -linear NC.

An optimal normal NC over $\mathbb{P} = \text{GF}(3)$



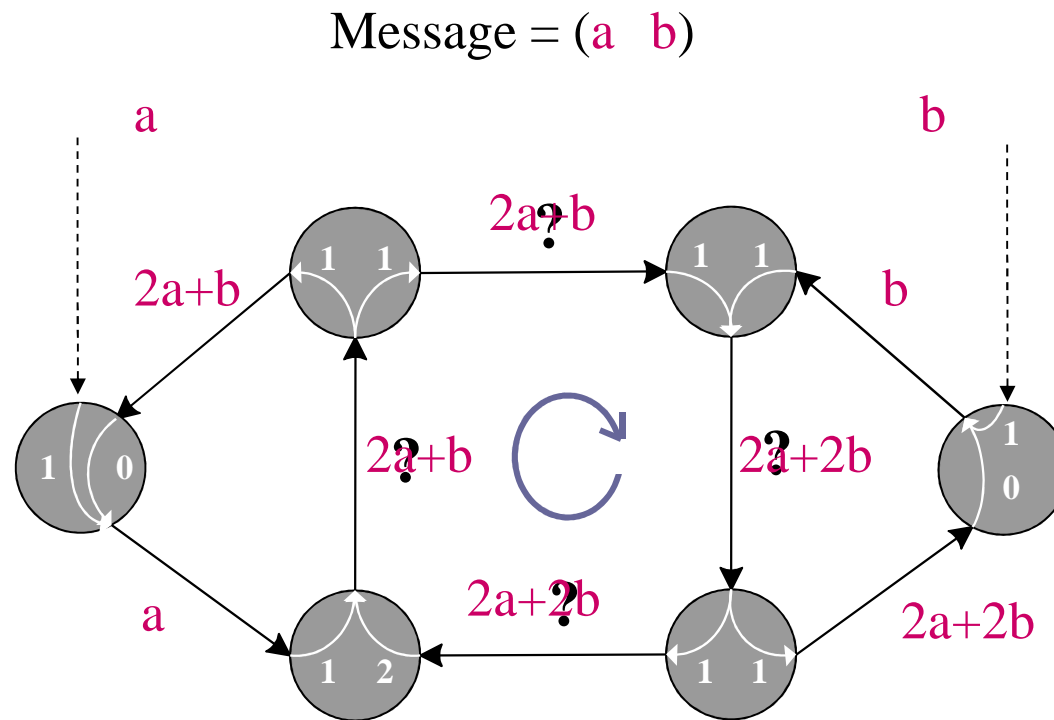
A normal GF(3)-linear code on the *Shuttle Network*

An optimal normal NC over $\mathbb{P} = \text{GF}(3)$



A normal $\text{GF}(3)$ -linear code on the *Shuttle Network*

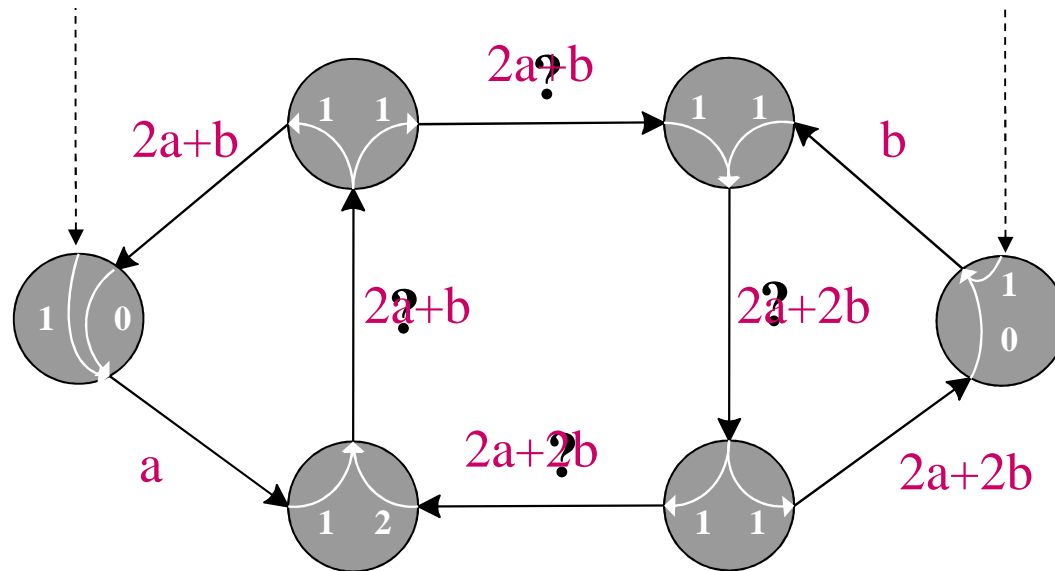
Deadlock in cyclic data propagation



A normal GF(3)-linear code on the *Shuttle Network*

Deadlock in cyclic data propagation

To break **deadlock** in data propagation, we need some kind of **acyclic attribute** of either the network topology or the algebraic structure of data units.



In this case, the network contains cycles and the PID $\mathbb{P} = \text{GF}(3)$ does not provide the needed **acyclic attribute** either.

Contents

- PID-based network coding

- Non-singular and normal network codes
- Existence of optimal code

Open problem. Formulate something **nice** in between for an **acyclic attribute**.

- DVR-based causal network coding

- Existence of optimal code
- Decoding

\mathbb{D} -linear NC and causality

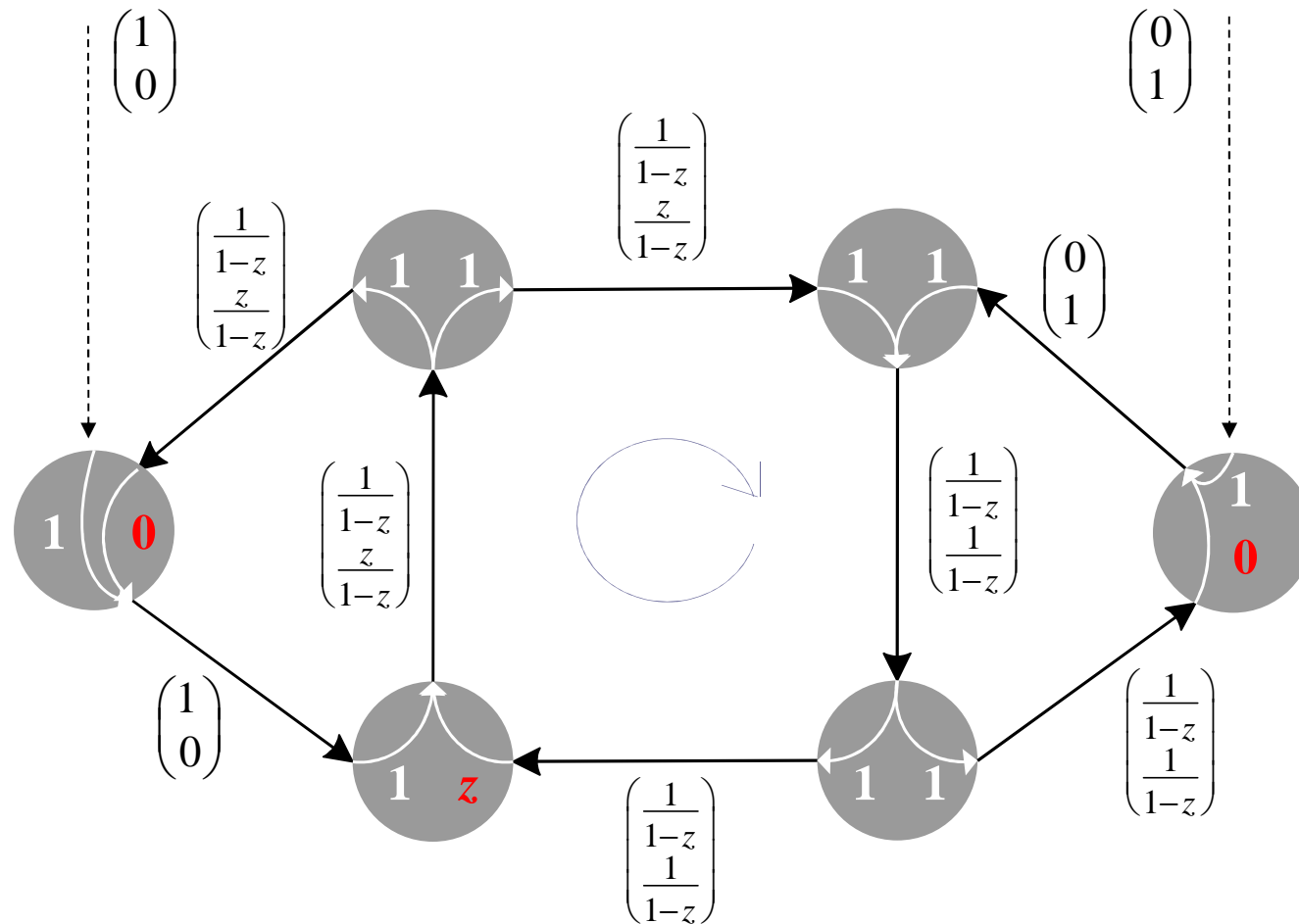
Definition. A \mathbb{D} -linear network code is said to be **causal** if:

- On every cycle, at least one pair (d, e) is with $k_{d,e}$ divisible by z ,
// $z = \text{uniformizer in } \mathbb{D}$

Theorem 2. **Causality** \Rightarrow **normality** for a \mathbb{D} -linear network code.

Proof. Skipped.

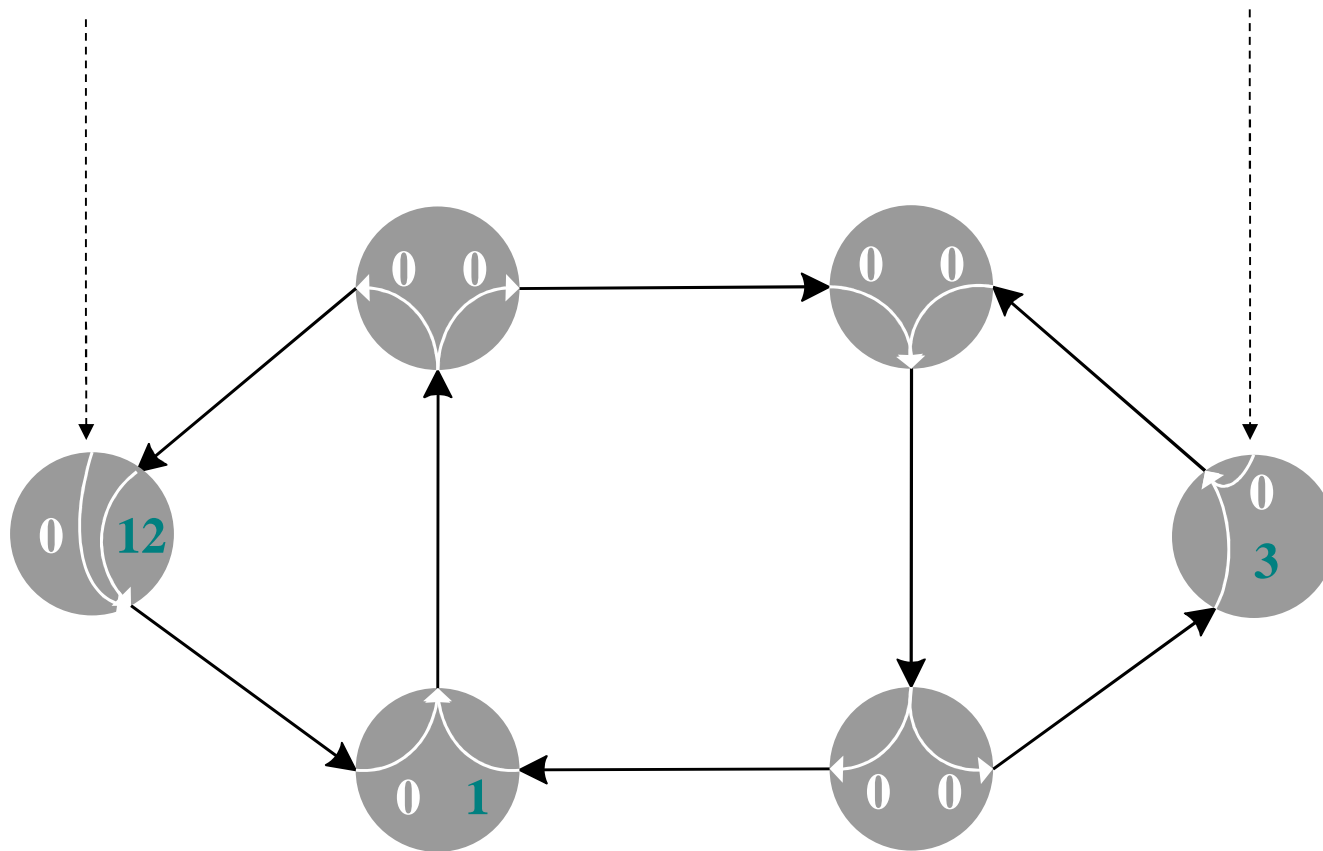
Example of a **causal** $\mathbb{F}[(D)]$ -linear network code



Delay function on a network with cycles

Definitions. A **delay function** t maps adjacent pairs to integer ≥ 0 such that

- along every cycle, $t(d, e) > 0$ for at least one adjacent pair (d, e) .



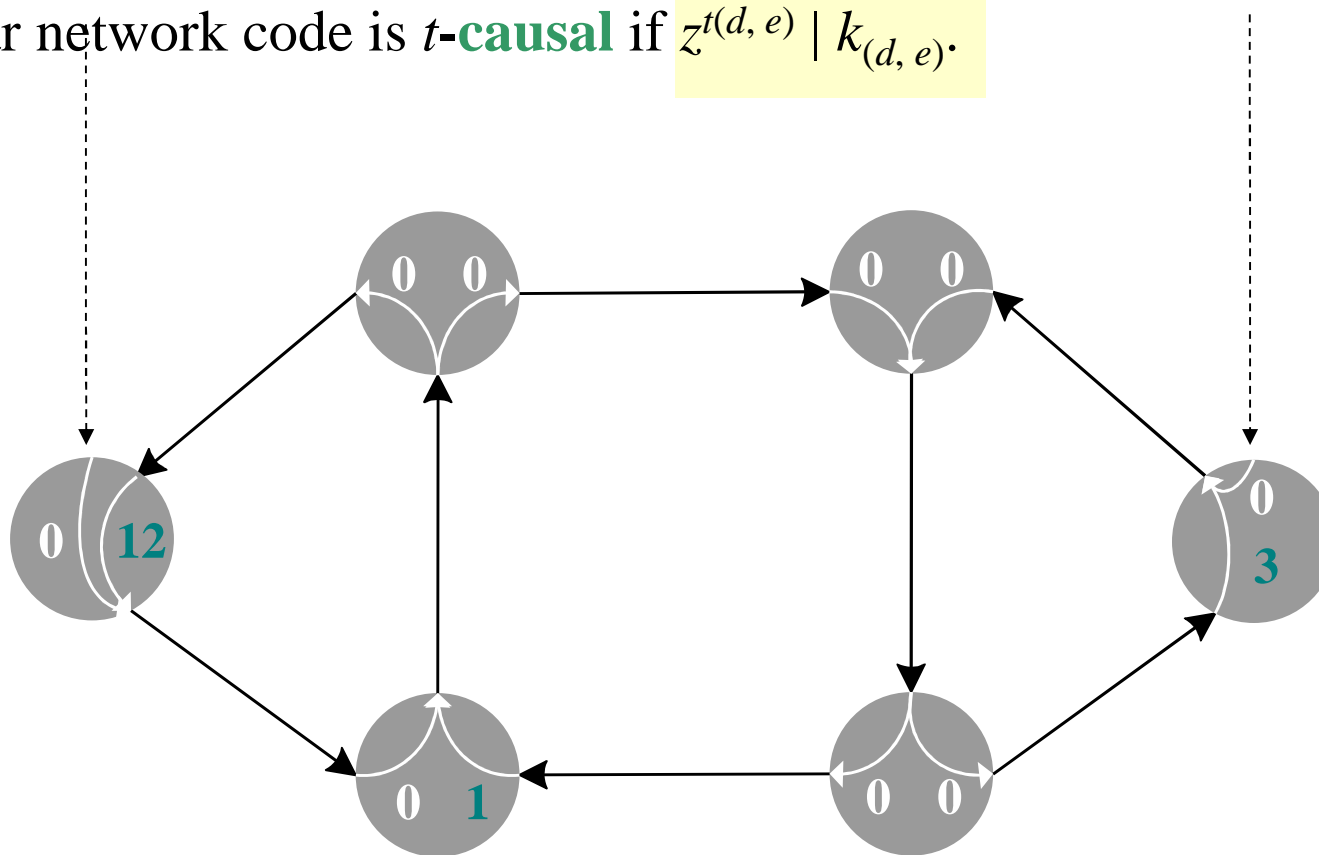
A delay function t .

Causal Data Propagation by DVR-based NC

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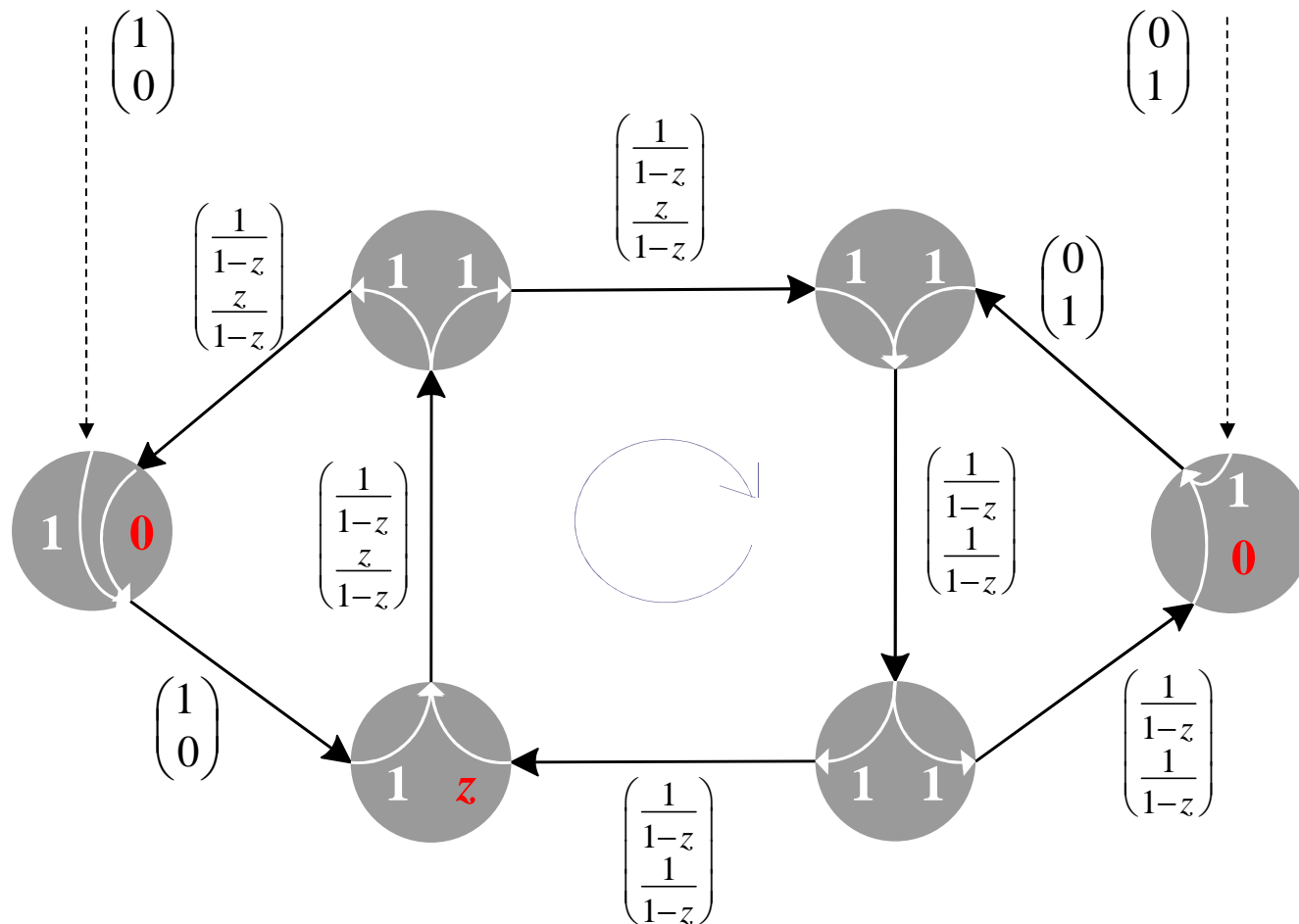
A \mathbb{D} -linear network code is **t -causal** if $z^{t(d, e)} \mid k_{(d, e)}$.



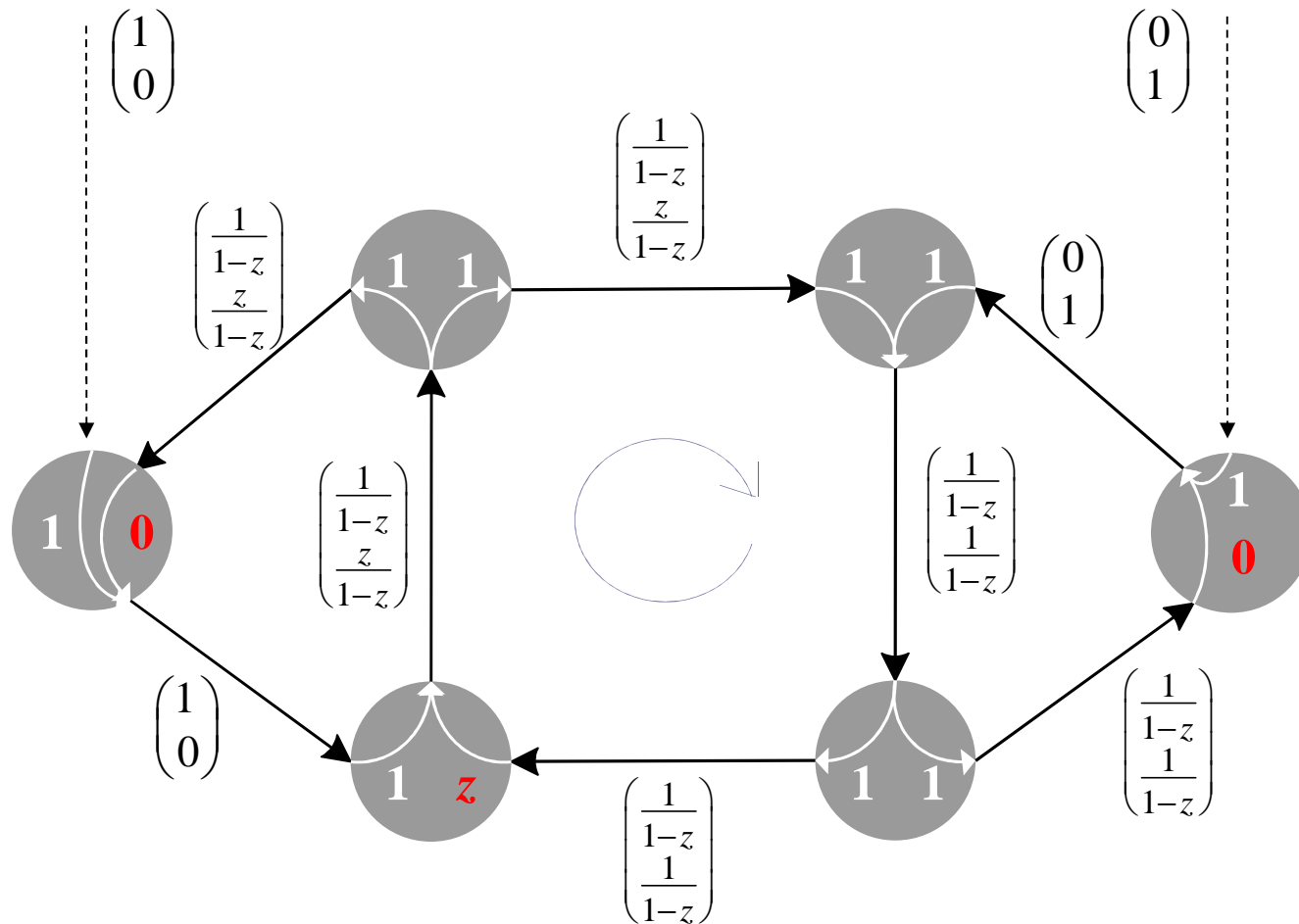
A delay function t .

A t -causal \mathbb{D} -linear network code

$$z^{12} \mid \mathbf{0}; \quad z^1 \mid \mathbf{z}; \quad z^3 \mid \mathbf{0}$$



Example of a t -causal $\mathbb{F}[(D)]$ -linear network code



Optimal DVR-based Network Codes

Theorem 3. Let \mathbb{D} be a DVR. Given a delay function t , there exists an optimal t -causal \mathbb{D} -linear NC.

Proof. Let \mathbb{Q} be the quotient field of \mathbb{D} , and m the largest $t(d, e)$ among all adjacent pairs (d, e) .

The ideal $z^m \cdot \mathbb{D}$ shares the same cardinality with \mathbb{D} , which is infinite.

From the **Lemma 1**, there exists

- an optimal \mathbb{Q} -linear NC C with coding coefficients $k_{d,e} \in z^m \cdot \mathbb{D}$.

\Rightarrow a t -causal \mathbb{D} -linear network code

\Rightarrow a t -causal normal \mathbb{D} -linear network code

\Rightarrow An optimal t -causal \mathbb{D} -linear NC as well

Optimal DVR-based Network Codes

Theorem 3. There exists an optimal t -causal \mathbb{D} -linear NC.

Proof. Skipped.

Optimal DVR-based Network Codes

Theorem 3. There exists an optimal *causal* \mathbb{D} -linear NC.

Proof. Skipped.

Contents

- PID-based network coding
 - Non-singular and normal network codes
 - Existence of optimal code
- DVR-based causal network coding
 - Existence of optimal code
 - Decoding

Inv. Factor Thm. of Free Submodule over a PID

Assume that v is eligible for receiving the message.

// maxflow from s to v is at least ω

By the Invariant Factor Theorem of Free Submodule over a PID :

- 1) The received submodule $\langle f_e : e \in \text{In}(v) \rangle$ of the source module \mathbb{D}^ω is also a free \mathbb{D} -module at the rank ω
- 2) There is a basis $\{u_1, \dots, u_\omega\}$ of the source module and a basis $\{d_1 u_1, \dots, d_\omega u_\omega\}$ of the received submodule, where $d_1, \dots, d_\omega \in \mathbb{D}$.
- 3) The elements d_1, \dots, d_ω can be so chosen that $d_1 \mid d_2 \mid \dots \mid d_\omega$.
Moreover, such a choice is unique up to unit factors. The unique $d_1, d_2, \dots, d_\omega$ are called the invariant factors of the received submodule in the source module.

Inv. Factor Thm. of Free Submodule over a DVR

Assume that maxflow from s to v is at least ω .

// so that v is eligible for receiving the message

By the Invariant Factor Theorem of Free Submodule over a PID :

- 1) The received submodule $\langle f_e: e \in \text{In}(v) \rangle$ of the source module \mathbb{D}^ω is also a free \mathbb{D} -module at the rank ω
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Since \mathbb{D} is a DVR, we may write

- $d_1 = z^{i_1}, \dots, d_\omega = z^{i_\omega}$ up to multiplication by units // $i_j \geq 0$

Then, reorder d_1, \dots, d_ω so that $i_1 \leq \dots \leq i_\omega$

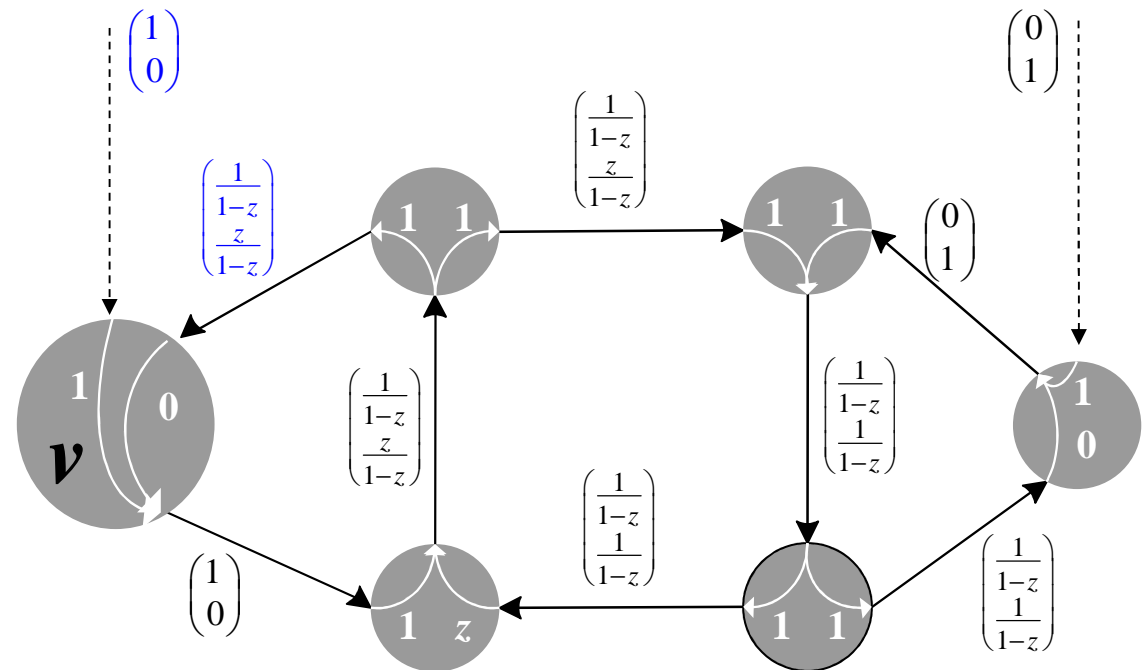
The sequence (i_1, \dots, i_ω) is unique.

Example of decoding a \mathbb{D} -linear NC

Node ν receives data units

$$(\mathbf{a} \ \mathbf{b}) \cdot \begin{bmatrix} 1 & \frac{1}{1-z} \\ 0 & \frac{z}{1-z} \end{bmatrix} = \begin{pmatrix} \mathbf{a} & \frac{\mathbf{a} + \mathbf{b}z}{1-z} \end{pmatrix}$$

Message = $(\mathbf{a} \ \mathbf{b}) \in \mathbb{D}^2$



An optimal causal \mathbb{D} -linear NC on the *Shuttle Network*

Example of decoding a \mathbb{D} -linear NC

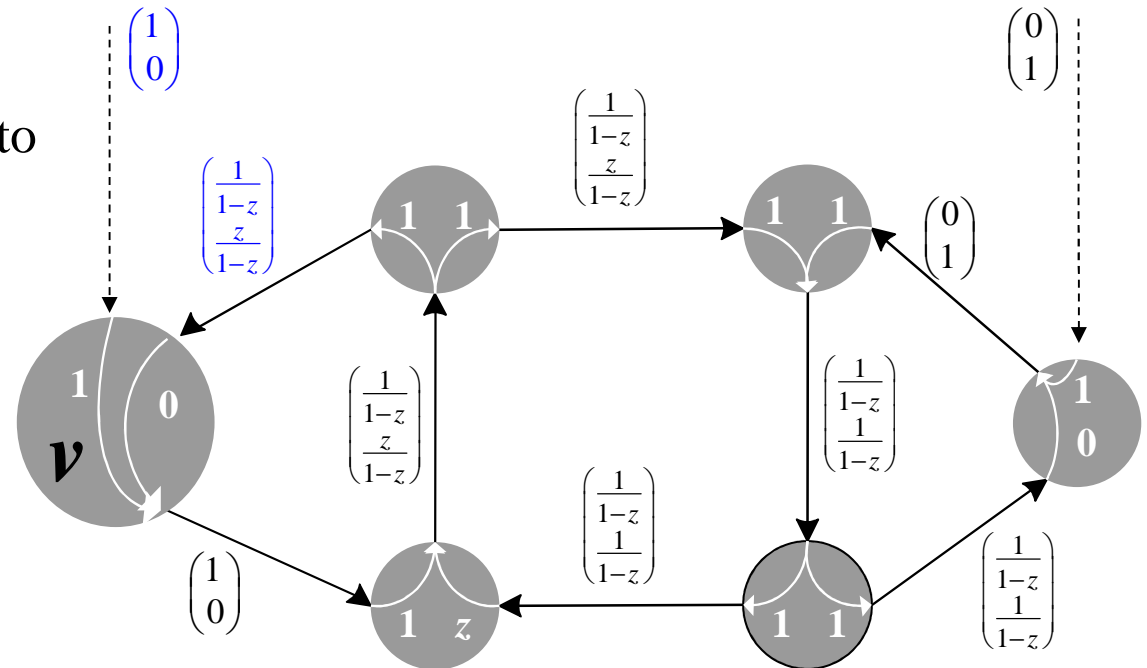
Node v receives data units

$$(\mathbf{a} \ \mathbf{b}) \cdot \begin{bmatrix} 1 & \frac{1}{1-z} \\ 0 & \frac{z}{1-z} \end{bmatrix} = \begin{pmatrix} \mathbf{a} & \frac{\mathbf{a} + \mathbf{b}z}{1-z} \end{pmatrix}$$

Apply **Invariant Factor Theorem** to $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$. We find

$$i_1 = 0 \text{ and } i_2 = 1.$$

$$\text{Message} = (\mathbf{a} \ \mathbf{b}) \in \mathbb{D}^2$$



An optimal causal \mathbb{D} -linear NC on the *Shuttle Network*

Decoding of an optimal causal \mathbb{D} -linear NC

v = an eligible receiver of the message. By the **Invariant Factor Theorem of Free Submodule over a PID**, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$.

The goal is to establish:

$$[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot [\text{Some matrix}] = z^i I_\omega$$

Why? Let the message be the row vector $(\mathbf{a}_1 \ \mathbf{a}_2 \ \dots \ \mathbf{a}_\omega)$. Then,

$$(\mathbf{a}_1 \ \mathbf{a}_2 \ \dots \ \mathbf{a}_\omega) \cdot [\mathbf{f}_e]_{e \in \text{In}(v)} \cdot [\text{Some matrix}] = z^i (\mathbf{a}_1 \ \mathbf{a}_2 \ \dots \ \mathbf{a}_\omega)$$

Received data
by the node v

A decoding matrix at
the node v with the
“decoding delay” z^i

$i = i_\omega$ is the highest valuation
among invariant factors of
the received submodule.

Example of decoding a \mathbb{D} -linear NC

Node v receives data units

$$(\mathbf{a} \ \mathbf{b}) \cdot \begin{bmatrix} 1 & \frac{1}{1-z} \\ 0 & \frac{z}{1-z} \end{bmatrix} = \begin{pmatrix} \mathbf{a} & \frac{\mathbf{a}+\mathbf{b}z}{1-z} \end{pmatrix}$$

Apply **Invariant Factor Theorem** to $\langle f_e : e \in \text{In}(v) \rangle$. We find

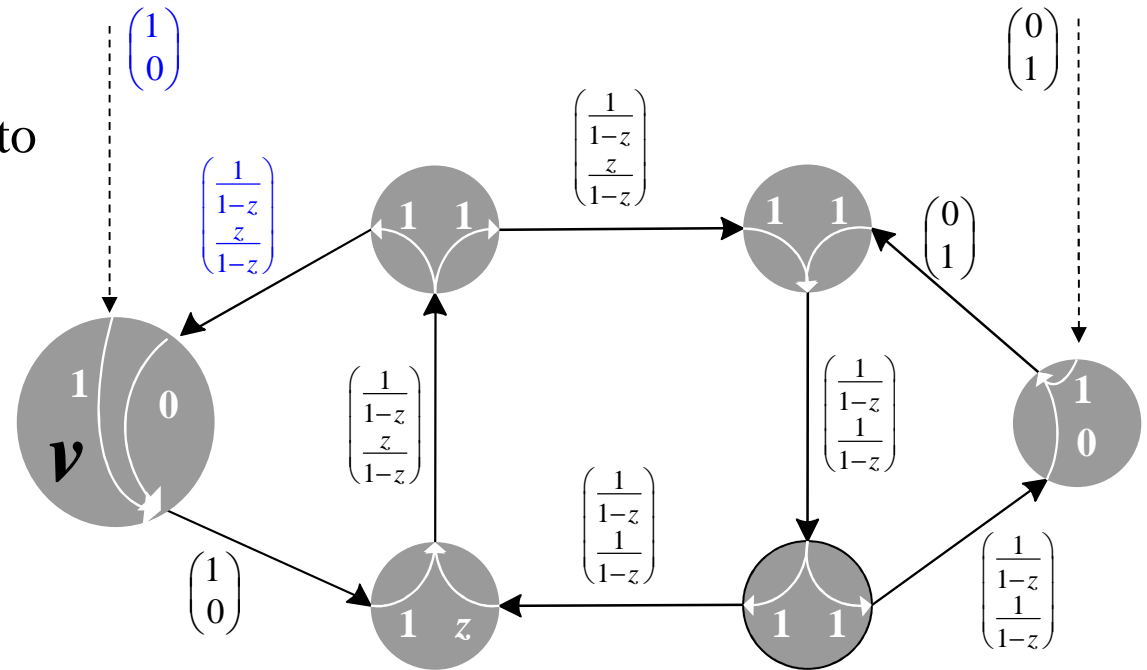
$$i_1 = 0 \text{ and } i_2 = 1$$

Decode the message $(\mathbf{a} \ \mathbf{b})$ with delay z^1 via

$$\begin{pmatrix} \mathbf{a} & \frac{\mathbf{a}+\mathbf{b}z}{1-z} \end{pmatrix} \cdot \begin{bmatrix} z & -1 \\ 0 & 1-z \end{bmatrix} = z^1 (\mathbf{a} \ \mathbf{b})$$

Decoding matrix

Message = $(\mathbf{a} \ \mathbf{b}) \in \mathbb{D}^2$



An optimal causal \mathbb{D} -linear NC on the *Shuttle Network*

Decoding of an optimal causal \mathbb{D} -linear NC

v = an eligible receiver of the message. By the **Invariant Factor Theorem of Free Submodule over a PID**, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$. Thus, there exists an $|\text{In}(v)| \times \omega$ matrix \mathbf{M} over \mathbb{D} such that

$$[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{M} = [z^{i_j}\mathbf{u}_j]_{1 \leq j \leq \omega}$$

Decoding of an optimal causal \mathbb{D} -linear NC

v = an eligible receiver of the message. By the Invariant Factor Theorem of Free Submodule over a PID, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is

also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$.

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Write $[z^{i_j}\mathbf{u}_j]_{1 \leq j \leq \omega} \cdot \mathbf{D} = [z^i\mathbf{u}_j]_{1 \leq j \leq \omega} = z^i [\mathbf{u}_j]_{1 \leq j \leq \omega}$, where \mathbf{D} is the diagonal matrix with diagonal entries z^{i-i_j} .

Decoding of an optimal causal \mathbb{D} -linear NC

v = an eligible receiver of the message. By the **Invariant Factor Theorem of Free Submodule over a PID**, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1} \mathbf{u}_1, \dots, z^{i_\omega} \mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$. Thus, there exists an $|\text{In}(v)| \times \omega$ matrix \mathbf{M} over \mathbb{D} such that

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$$[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{M} \cdot \mathbf{D} = z^i [\mathbf{u}_j]_{1 \leq j \leq \omega}$$

Decoding of an optimal causal \mathbb{D} -linear NC

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$$[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{M} \cdot \mathbf{D} = z^i [\mathbf{u}_j]_{1 \leq j \leq \omega}$$

$$[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{M} \cdot \mathbf{D} \cdot ([\mathbf{u}_j]_{1 \leq j \leq \omega})^{-1} = z^i \mathbf{I}_\omega$$

Decoding of an optimal causal \mathbb{D} -linear NC

v = an eligible receiver of the message. By the **Invariant Factor Theorem of Free Submodule over a PID**, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$.

$$\begin{aligned} [\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{M} \cdot \mathbf{D} \cdot ([\mathbf{u}_j]_{1 \leq j \leq \omega})^{-1} &= z^i \mathbf{I}_\omega \\ &= [\text{Some matrix}] \\ &\quad \text{for decoding} \end{aligned}$$

z^i = optimal decoding “delay”

v = an eligible receiver of the message. By the **Invariant Factor Theorem of Free Submodule over a PID**, the received submodule $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$ of \mathbb{D}^ω is also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e : e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$.

Task. Assuming the existence of a decoding matrix A at the “delay” z^k , we are to show that $k \geq i$.

z^i = optimal decoding “delay”

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also a free \mathbb{D} -module of rank ω and there is a basis $\{\mathbf{u}_1, \dots, \mathbf{u}_\omega\}$ of \mathbb{D}^ω so that $\{z^{i_1}\mathbf{u}_1, \dots, z^{i_\omega}\mathbf{u}_\omega\}$ is a basis of $\langle \mathbf{f}_e: e \in \text{In}(v) \rangle$, where $0 \leq i_1 \leq \dots \leq i_\omega = i$.

Thus, there exists an $\omega \times |\text{In}(v)|$ matrix \mathbf{M}' over \mathbb{D} such that

$$[z^{i_j}\mathbf{u}_j]_{1 \leq j \leq \omega} \cdot \mathbf{M}' = [\mathbf{f}_e]_{e \in \text{In}(v)} \quad // \text{Symmetric to previous argument}$$

Or equivalently,

$$[\mathbf{u}_j]_{1 \leq j \leq \omega} \cdot \mathbf{D}' \cdot \mathbf{M}' = [\mathbf{f}_e]_{e \in \text{In}(v)}, \text{ where } \mathbf{D}' \text{ is the diagonal matrix with diagonal entries } z^{i_j}$$

z^i = optimal decoding “delay”

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Task. Assuming $[\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{A} = z^k \mathbf{I}_\omega$ we are to show that $k \geq i$.

$$[\mathbf{u}_j]_{1 \leq j \leq \omega} \cdot \mathbf{D}' \cdot \mathbf{M}' \cdot \mathbf{A} = [\mathbf{f}_e]_{e \in \text{In}(v)} \cdot \mathbf{A} = z^k \mathbf{I}_\omega$$

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$$[\mathbf{u}_j]_{1 \leq j \leq \omega} \cdot \mathbf{D}' \cdot \mathbf{M}' \cdot \mathbf{A} = z^k \mathbf{I}_\omega$$

where \mathbf{D}' is the diagonal matrix with diagonal entries z^{i_j} . Thus

$$\mathbf{D}' \cdot \mathbf{M}' \cdot \mathbf{A} \cdot [\mathbf{u}_j]_{1 \leq j \leq \omega} = z^k \mathbf{I}_\omega$$

Presence of z^i on the bottom row of the diagonal matrix $\mathbf{D}' \Rightarrow z^i \mid z^k$

Convolutional decoding with delay i

Abbreviate the matrix $[f_e]_{e \in \text{In}(v)}$ as F .

Thus, there exists an $|\text{In}(v)| \times \omega$ matrix A over $\mathbb{F}[(D)]$ such that

$$F \cdot A = D^i I_\omega$$

Write $F = \sum_{n=0}^{\infty} D^n F_n$, where F_n is a matrix over \mathbb{F} ,

$$A = \sum_{n=0}^{\infty} D^n A_n, \text{ where } A_n \text{ is a matrix over } \mathbb{F}$$

$$\text{Thus, } \left(\sum_{n=0}^{\infty} D^n F_n \right) \left(\sum_{n=0}^{\infty} D^n A_n \right) = D^i I_\omega$$

Equate coefficients of D^n on both sides by convolution among matrices.

- The coefficient of D^i is equal to I_ω
- The coefficient of D^j is equal to the zero matrix for all $j \neq i$.

Decoding delay i of convolutional NC

The first $i+1$ equations of matrix convolution can be summarized as:

$$\begin{pmatrix} F_0 & F_1 & F_2 & \dots & F_i \\ 0 & F_0 & F_1 & \dots & F_{i-1} \\ 0 & 0 & F_0 & \dots & F_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & F_0 \end{pmatrix} \begin{pmatrix} A_0 & A_1 & A_2 & \dots & A_i \\ 0 & A_0 & A_1 & \dots & A_{i-1} \\ 0 & 0 & A_0 & \dots & A_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & A_0 \end{pmatrix} = \begin{pmatrix} 0 & 0 & 0 & \dots & I_\omega \\ 0 & 0 & 0 & \dots & 0 \\ 0 & 0 & 0 & \dots & 0 \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & 0 \end{pmatrix}$$

for “time-variant decoding.” Meanwhile,

$$\begin{pmatrix} \textcolor{red}{0} & \textcolor{red}{0} & \textcolor{red}{0} & \dots & \textcolor{red}{0} \\ \textcolor{red}{0} & F_0 & F_1 & \dots & F_{i-1} \\ \textcolor{red}{0} & 0 & F_0 & \dots & F_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ \textcolor{red}{0} & 0 & 0 & 0 & F_0 \end{pmatrix} \begin{pmatrix} A_0 & A_1 & A_2 & \dots & A_i \\ 0 & A_0 & A_1 & \dots & A_{i-1} \\ 0 & 0 & A_0 & \dots & A_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & A_0 \end{pmatrix} = \begin{pmatrix} 0 & 0 & 0 & \dots & \textcolor{red}{0} \\ 0 & 0 & 0 & \dots & 0 \\ 0 & 0 & 0 & \dots & 0 \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & 0 \end{pmatrix}$$

One way to calculate the decoding delay i

Thus the rank of the matrix

$$\begin{pmatrix} F_0 & F_1 & F_2 & \dots & F_i \\ 0 & F_0 & F_1 & \dots & F_{i-1} \\ 0 & 0 & F_0 & \dots & F_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & \dots & F_0 \end{pmatrix}$$

is ω higher than that of

$$\begin{pmatrix} \textcolor{red}{0} & \textcolor{red}{0} & \textcolor{red}{0} & \dots & \textcolor{red}{0} \\ \textcolor{red}{0} & F_0 & F_1 & \dots & F_{i-1} \\ \textcolor{red}{0} & 0 & F_0 & \dots & F_{i-2} \\ \dots & \dots & \dots & \dots & \dots \\ \textcolor{red}{0} & 0 & 0 & 0 & F_0 \end{pmatrix}.$$

This necessary condition for convolutional decoding at the delay i is also sufficient for “time-variant decoding” according to [Cai-Wang 2009], which is motivated by a result of [Massey-Sain 1968] on linear sequential circuit.

Summary of theory of linear NC

Acyclic LNC:

When the DVR *degenerates* into a field

A field \mathbb{F} is a PID, but the unique maximal ideal is $\{0\}$. No uniformizer!
It is the acyclic topology that endows LNC with normality & causality.

Convolutional NC:

When the $\text{DVR} = \mathbb{F}[(D)]$

DVR-based linear NC

The descending chain of ideals endows normality & causality.

Summary of theory of linear NC

Acyclic LNC:

when DVR degenerates into a field

Convolutional NC:

when $\text{DVR} = \mathbb{F}[(D)]$

DVR-based linear NC

Ensure normality and causality.

PID-based linear NC

Formulate normality of a code.

Conclusion

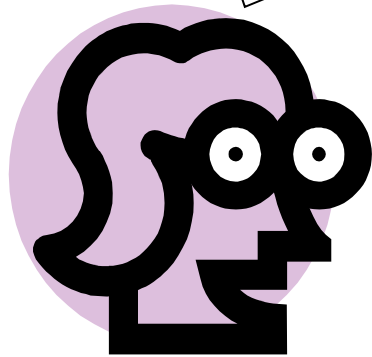


Mat



Eng

When the convolutional kernels belong to the polynomial ring $\mathbb{F}[D]$, there is no feedback, no loop and no inversion. Expansion of $\mathbb{F}[D]$ to $\mathbb{F}((D))$ enables the inversion of everything but time. This expansion means **localization** of $\mathbb{F}[D]$ at the **prime ideal** $\langle D \rangle$. The result $\mathbb{F}((D))$ is a **local ring**, in fact, a **DVR**.

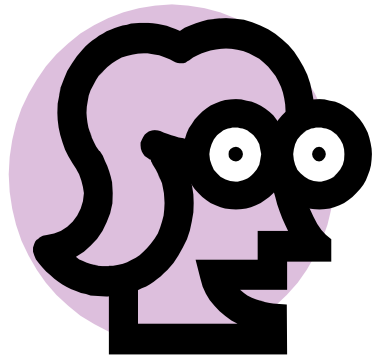


Mat



Eng

The descending chain of
ideals in a **DVR** is an abstract
generalization of the unidirectional
characteristic of time, ...

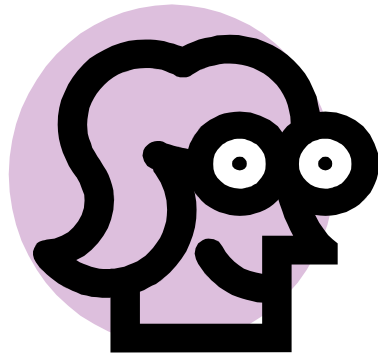


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... which has the effect
of breaking the deadlock
of cyclic transmission.

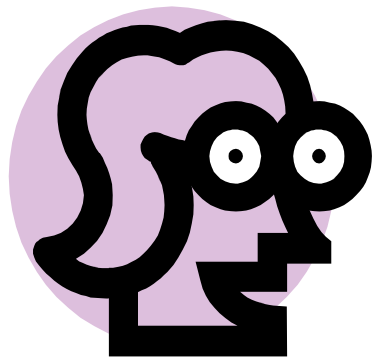


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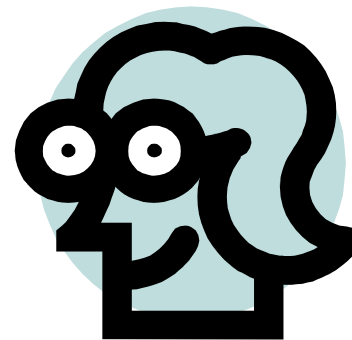


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Information accessed by a node
is a **free submodule** over the DVR. Its
invariant factors represent "**delay**" in a
generalized sense that is not
restricted to the time domain.

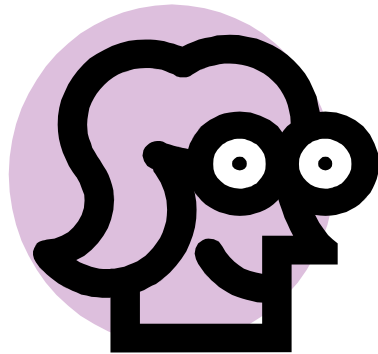


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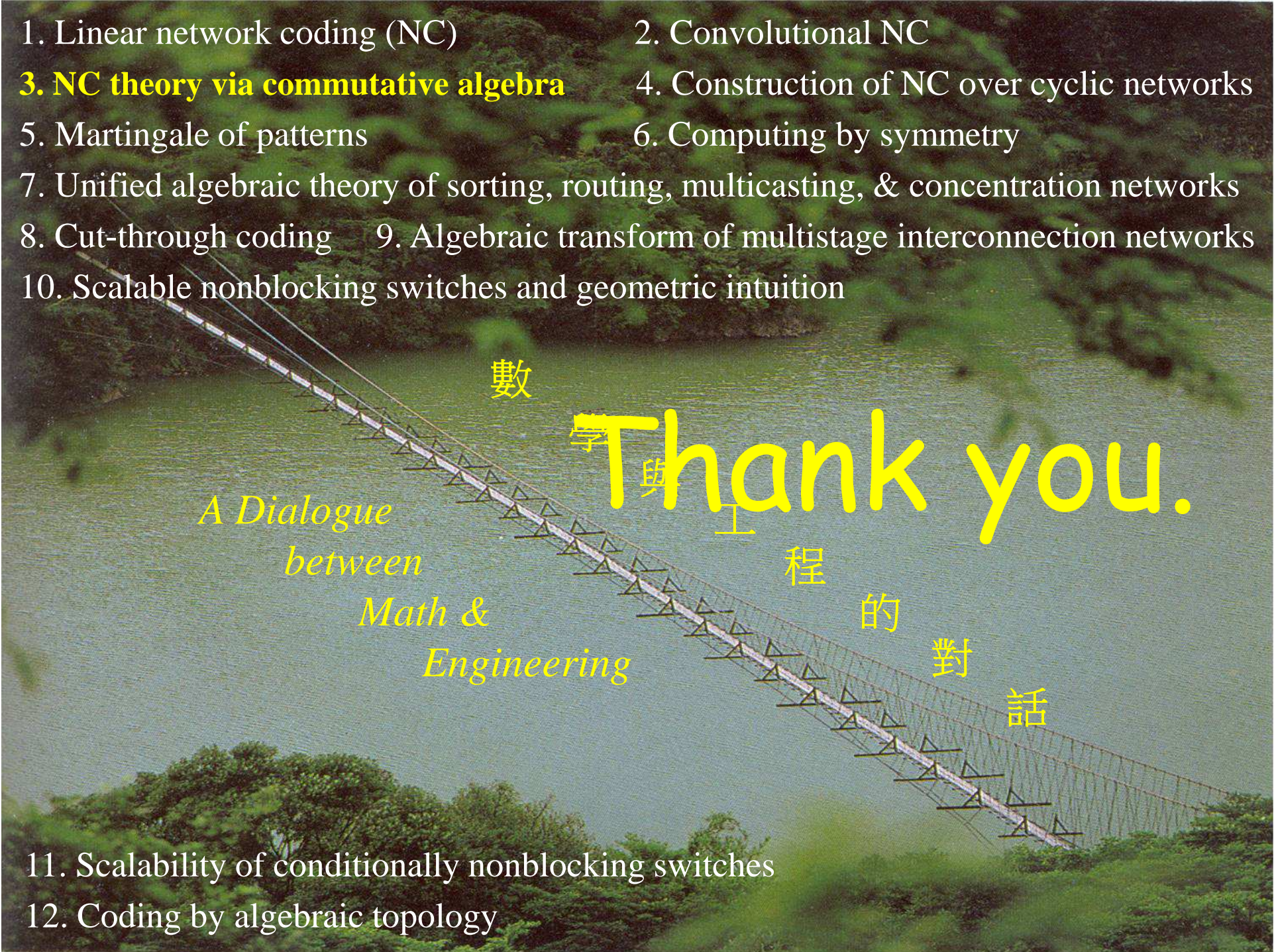
So, when the submodule is of the full rank, the original message can be **decoded** at a "**delay**" at the highest valuation in an invariant factor. When the "**delay**" represents a shift in any domain other than time, the code evades the synchronization problem.



Mat



Eng

- 
1. Linear network coding (NC)
 2. Convolutional NC
 - 3. NC theory via commutative algebra**
 4. Construction of NC over cyclic networks
 5. Martingale of patterns
 6. Computing by symmetry
 7. Unified algebraic theory of sorting, routing, multicasting, & concentration networks
 8. Cut-through coding
 9. Algebraic transform of multistage interconnection networks
 10. Scalable nonblocking switches and geometric intuition

數學與工程的對話
A Dialogue between Math & Engineering
Thank you.

11. Scalability of conditionally nonblocking switches
12. Coding by algebraic topology

Some connections between Mathematics & Information Engineering

