

NCNC: Nash Codes for Noisy Channels

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Tenerife Airport, Canary Islands, 27 March 1977. Fog.

Two jumbo jets, from KLM and PanAm.

PanAm 1736 is taxiing back on the **runway**.

1705:44 KLM 4805: The KLM 4805 is now ready for takeoff and we are waiting for your ATC clearance.

1705:53 Tower: KLM 8705 **you are cleared** to the Papa Beacon, climb to maintain flight level [...]

1706:09 KLM 4805: Ah—roger sir, we are cleared to the Papa beacon [...]

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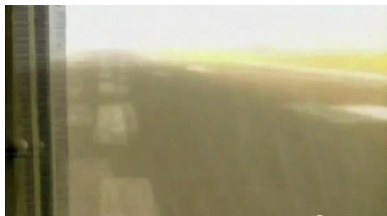
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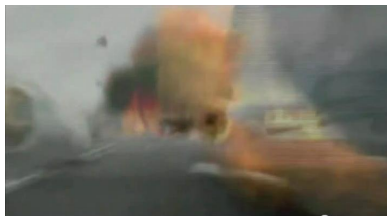
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Survivors from the KLM flight: 0, from the PanAm flight: 70.

583 lives lost, the deadliest aviation accident in history.

Motivation

- Communication is basic to interaction
- Coordination may be hindered by communication **errors**, including imprecisely worded or misunderstood messages
- Dealing with errors deserves game-theoretic analysis
- Model: noisy channel, requires codebook
- Using the codebook should define a Nash equilibrium
- We will describe *some* equilibrium codes.

Sender-receiver games in economics

- **Sender**, fully informed about state of nature sends message to **receiver**, who chooses action
- Crawford and Sobel (*Econometrica* 1982): state and message from $[0, 1]$, single-peaked but **non-identical** preference for action

Equilibrium: **finite** partition of $[0, 1]$, sender only tells partition
⇒ noise introduced **strategically**, **endogenous** from model

- Our model of communication: consider
 - given **finitely** many states and possible messages,
 - **coinciding** interests of sender and receiver,
 - noise **exogenously** given by **channel**

Sender-receiver game and noisy channel

- Two players: Sender and Receiver
- Nature chooses a *state* i from a set $\Omega = \{0, 1, \dots, M - 1\}$ with positive *prior* probability q_i
- Channel:
 - Input set \mathbf{X} , output set \mathbf{Y} .
 - Transition probabilities $p(\mathbf{y}|\mathbf{x})$ for each $\mathbf{x} \in \mathbf{X}$, $\mathbf{y} \in \mathbf{Y}$.
 - The channel is used n times independently without feedback.
 - An input $\mathbf{x} = (\mathbf{x}_1, \dots, \mathbf{x}_n)$ is transmitted through the channel. It is altered to an output $\mathbf{y} = (\mathbf{y}_1, \dots, \mathbf{y}_n)$ according to the probability $p(\mathbf{y}|\mathbf{x})$ given by

$$p(\mathbf{y}|\mathbf{x}) = \prod_{j=1}^n p(\mathbf{y}_j|\mathbf{x}_j).$$

Strategies

- Sender strategy: A **codebook** $(\mathbf{x}^0, \mathbf{x}^1, \dots, \mathbf{x}^{M-1})$ where \mathbf{x}^i is the **codeword** for state i :

$$\Omega \rightarrow \mathcal{X}^n$$

$$i \mapsto \mathbf{x}^i$$

- Receiver strategy: The receiver uses a probabilistic **decoding function**

$$\mathbf{d} : \mathcal{Y}^n \times \Omega \rightarrow \mathbb{R},$$

where $\mathbf{d}(\mathbf{y}, i)$ is the probability that \mathbf{y} is decoded as i .

Payoff / Nash equilibrium

- Sender and receiver have common interest: If state i is decoded correctly, they get positive payoff U_i and V_i , respectively, otherwise both get payoff zero.
- A codebook $(\mathbf{x}^0, \mathbf{x}^1, \dots, \mathbf{x}^{M-1})$ defines a Nash equilibrium if:
 - Receiver Condition: $d(\mathbf{y}, i) > 0$ only if

$$q_i V_i p(\mathbf{y}|\mathbf{x}^i) \geq q_k V_k p(\mathbf{y}|\mathbf{x}^k) \quad \forall k \in \Omega$$

- Sender Condition: At state i the sender *uses the codebook*, i.e. transmits codeword \mathbf{x}^i which fulfills for any other possible channel input \mathbf{x} in \mathbf{X}^n

$$U_i \sum_{\mathbf{y} \in \mathbf{Y}^n} p(\mathbf{y}|\mathbf{x}^i) d(\mathbf{y}, i) \geq U_i \sum_{\mathbf{y} \in \mathbf{Y}^n} p(\mathbf{y}|\mathbf{x}) d(\mathbf{y}, i).$$

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From best response partition to best response codebook

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with priors

$$q_i \quad p(\mathbf{y}|\mathbf{x}^i) \geq q_k \quad p(\mathbf{y}|\mathbf{x}^k) \quad \forall k \in \Omega$$

From best response partition to best response codebook

Receiver Condition:

$d(\mathbf{y}, i) > \mathbf{0}$ only if

with priors and utilities

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From best response partition to best response codebook

Receiver Condition:

$d(\mathbf{y}, i) > 0$ only if $\mathbf{y} \in Y_i$

with decoding partition with priors and utilities

$$Y_i = \{ \mathbf{y} \in \mathcal{Y}^n \mid q_i V_i p(\mathbf{y} | \mathbf{x}^i) \geq q_k V_k p(\mathbf{y} | \mathbf{x}^k) \quad \forall k \in \Omega \}$$

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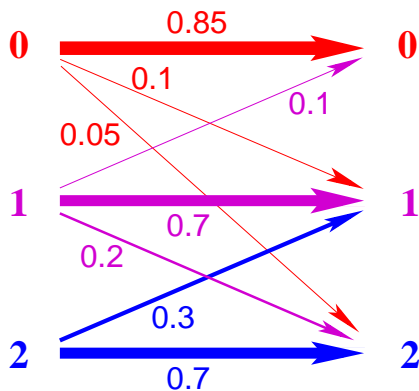
Sender Condition:

$$\sum_{\mathbf{y} \in Y_i} p(\mathbf{y} | \mathbf{x}) \mathbf{d}(\mathbf{y}, i) \text{ maximized for } \mathbf{x} = \mathbf{x}^i.$$

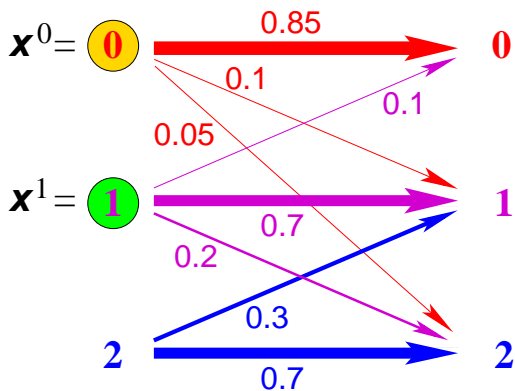
Questions

- 1. Is every code a Nash code?**

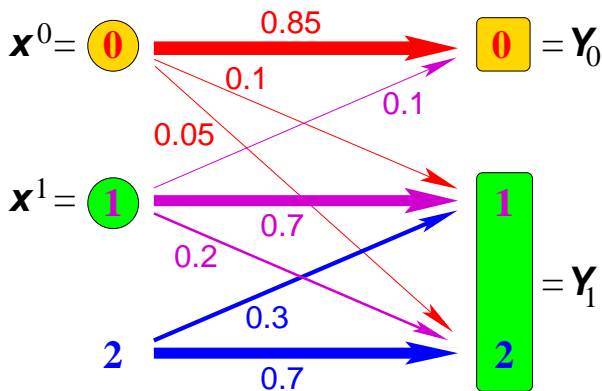
Noisy channel: Example



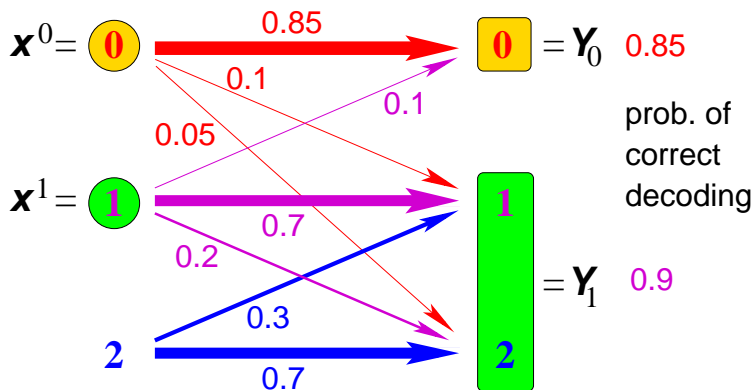
Encoding two states 0 and 1



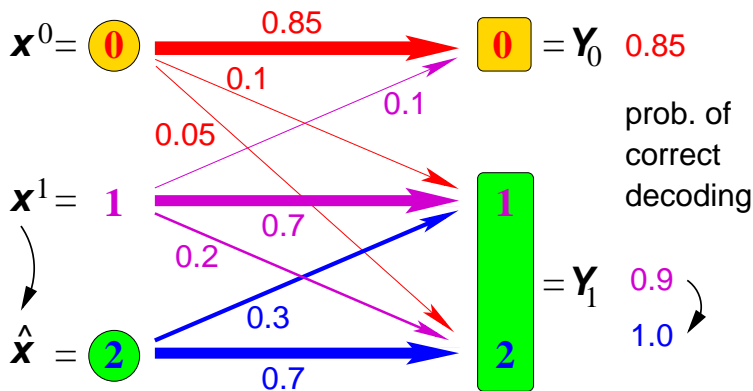
Best-response decoding: partition of \mathcal{Y}



Sender payoff for this code



Sender deviation: not a Nash code!



Questions

1. Is every code a Nash code? – no
2. **Is some code a Nash code?**

Sufficient condition for Nash codes

Definition:

A **receiver-optimal code** is a codebook $\mathbf{c} = (\mathbf{x}^0, \mathbf{x}^1, \dots, \mathbf{x}^{M-1})$ that maximizes the receiver payoff

$$V(\mathbf{c}, \mathbf{d}) = \sum_{i \in \Omega} q_i V_i \sum_{y \in Y_i} p(y|x^i) d(y, i)$$

for best-response decoding \mathbf{d} .

Theorem: Every receiver-optimal code is a Nash code.

Proof:

Let $\mathbf{c} = (\mathbf{x}^0, \mathbf{x}^1, \dots, \mathbf{x}^{M-1})$ be a receiver-optimal codebook with best-response decoding \mathbf{d} .

Profitable sender deviation from \mathbf{x}^i to $\hat{\mathbf{x}}$ means

$$\sum_{y \in Y_i} p(y|\hat{\mathbf{x}}) d(y, i) > \sum_{y \in Y_i} p(y|\mathbf{x}^i) d(y, i)$$

\Rightarrow sender **and** receiver improve

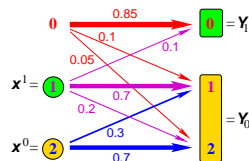
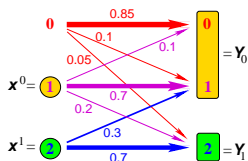
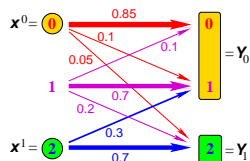
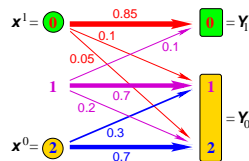
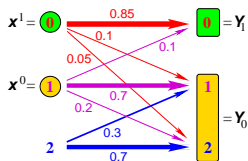
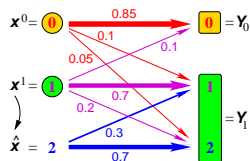
\Rightarrow for codebook $\mathbf{c}' = (\mathbf{x}^0, \mathbf{x}^1, \dots, \mathbf{x}^{i-1}, \hat{\mathbf{x}}, \mathbf{x}^{i+1}, \dots, \mathbf{x}^{M-1})$ and best-response decoding \mathbf{d}' : Receiver payoffs fulfill

$$V(\mathbf{c}, \mathbf{d}) < V(\mathbf{c}', \mathbf{d}) \leq V(\mathbf{c}', \mathbf{d}')$$

\Rightarrow \mathbf{c}' is better code for receiver than \mathbf{c} , contradiction.

Sender-optimal code not necessarily Nash code!

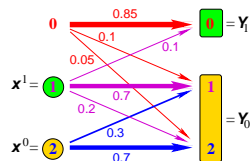
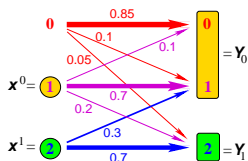
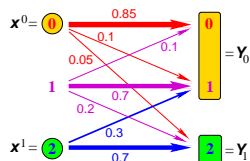
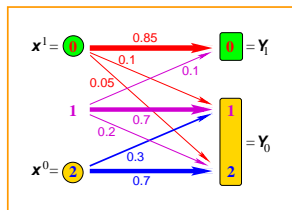
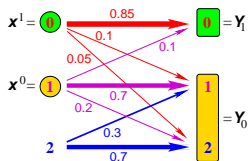
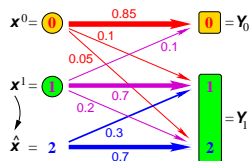
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 receiver: $V_0 = 7.6$, $V_1 = 2.4$



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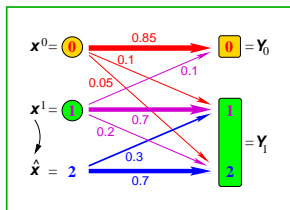
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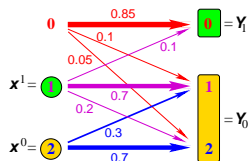
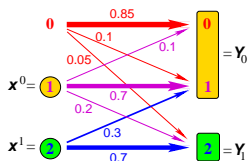
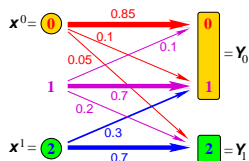
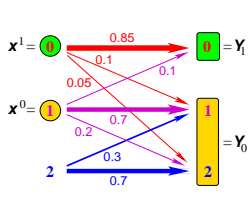
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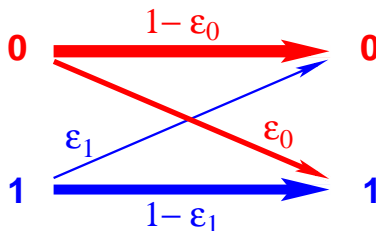
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2. Is some code a Nash code? – yes, receiver-optimal code is Nash
3. **Do small alphabets allow for more Nash codes?**

Binary channel

$$\mathbf{X} = \mathbf{Y} = \{0, 1\}$$

Transmission errors:



Can assume $\epsilon_0 + \epsilon_1 < 1$.

Symmetric channel: $\epsilon_0 = \epsilon_1 = \epsilon$

Use n times independently.

Conditions needed for binary code to be Nash

- ? receiver-optimal code
- ? symmetric channel errors, $\varepsilon_0 = \varepsilon_1$
- ? uniform priors \mathbf{q}_i
- ? unit payoffs, $\mathbf{V}_i = \mathbf{1}$
- ? equal payoffs for sender and receiver, $\mathbf{U}_i = \mathbf{V}_i$
- ? consistent tie breaking if $\mathbf{q}_i \mathbf{V}_i p(\mathbf{y}|\mathbf{x}^i) = \mathbf{q}_k \mathbf{V}_k p(\mathbf{y}|\mathbf{x}^k)$

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Examples: uniform (or any fixed) probability among tied states i, k ; fixed-order tie breaking (always i before k).

For generic priors \mathbf{q}_i there are no ties.

Conditions needed for binary code to be Nash

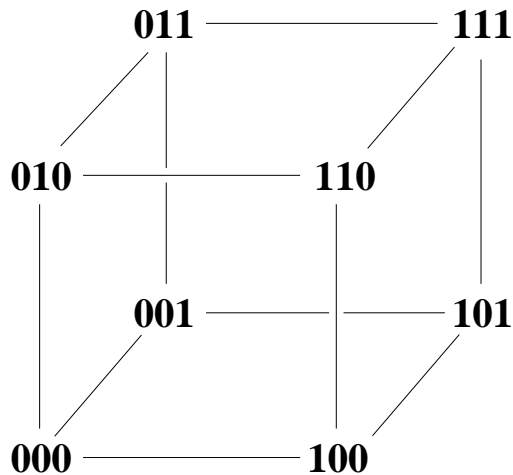
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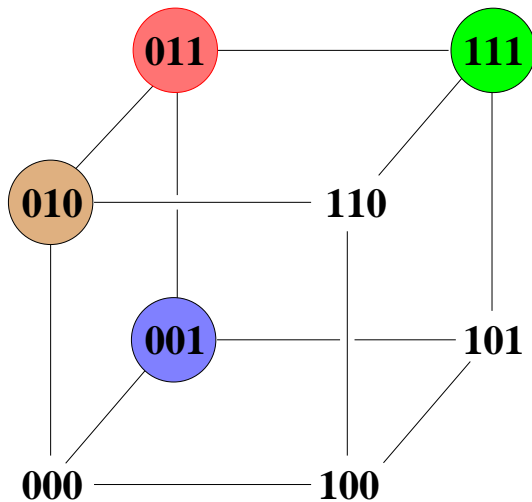
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Theorem: Every consistently decoded binary code is a Nash code.

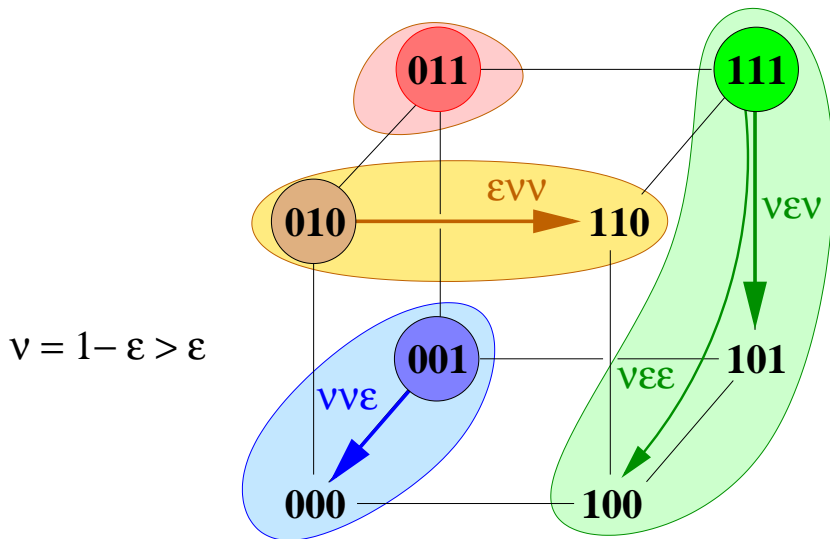
Binary channel, codewords length 3



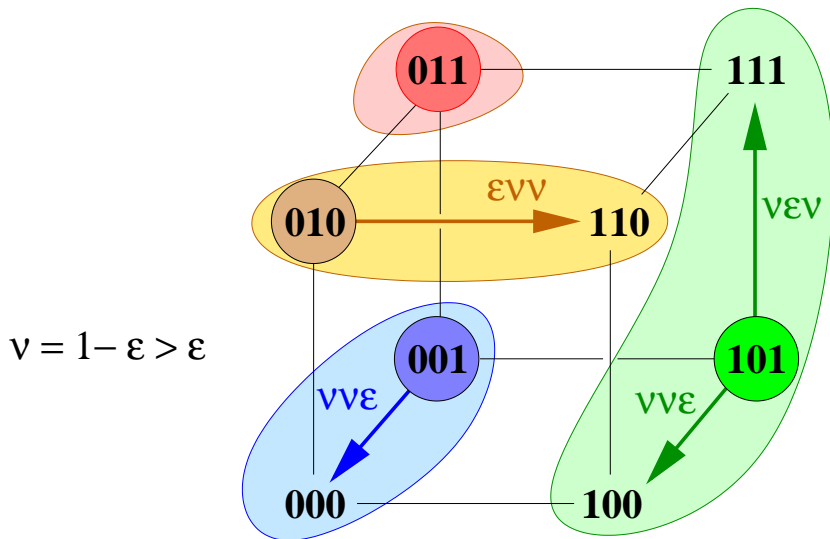
Four codewords



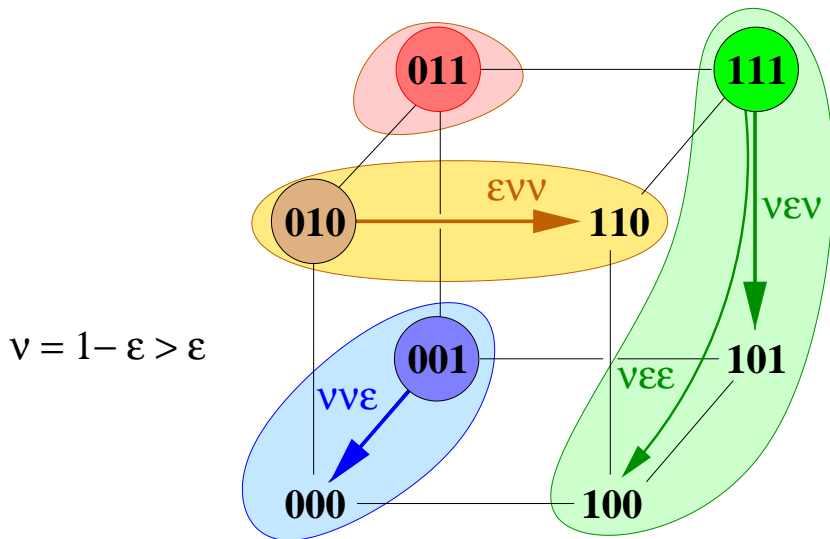
A decoding partition and its errors



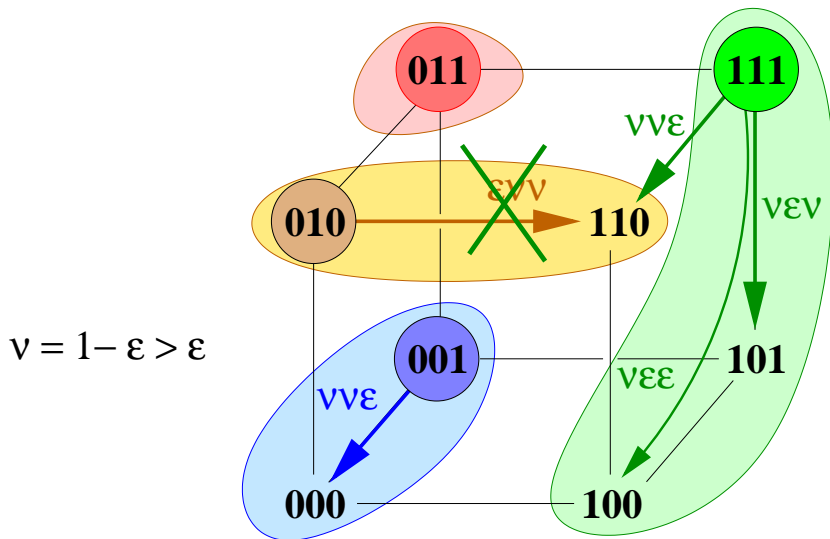
Deviate and get smaller errors: not Nash!



Decoding inconsistent: 110 should decode as 111

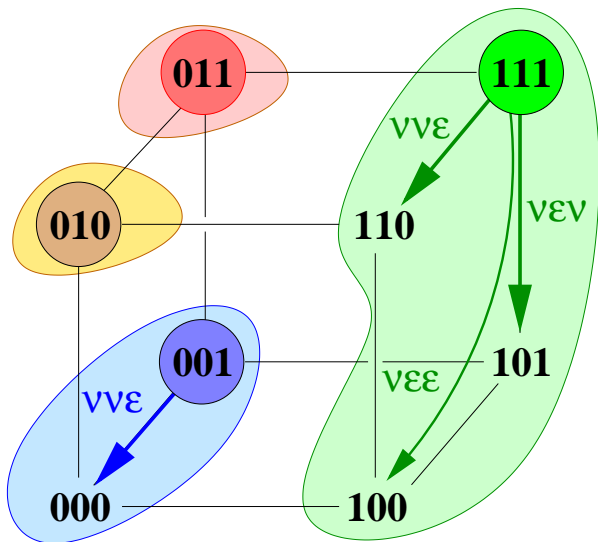


... because 100 decodes as 111



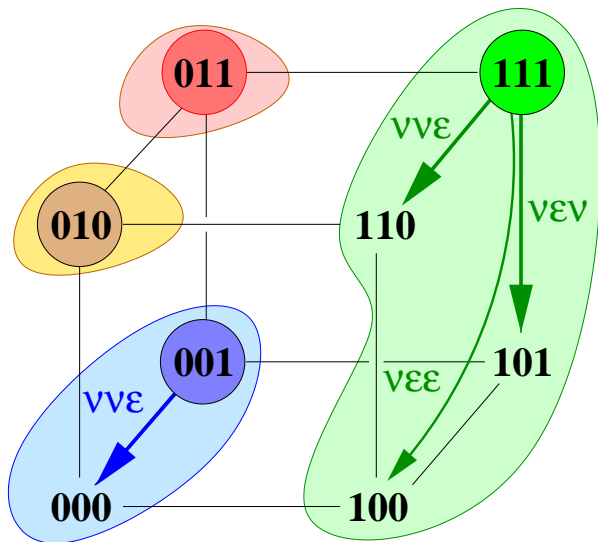
This decoding is consistent

$$v = 1 - \epsilon > \epsilon$$



This decoding is consistent ... and Nash

$$v = 1 - \epsilon > \epsilon$$



Main feature of consistent decoding

Decoding is **monotone**:

if y decoded as i and y' agrees with codeword x^i more than y ,
then y' also decoded as i .

Example: $x^i = 111$, $y = 100$, $y' = 110$

Main feature of consistent decoding

Decoding is **monotone**:

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Example: $x^i = 111$, $y = 100$, $y' = 110$

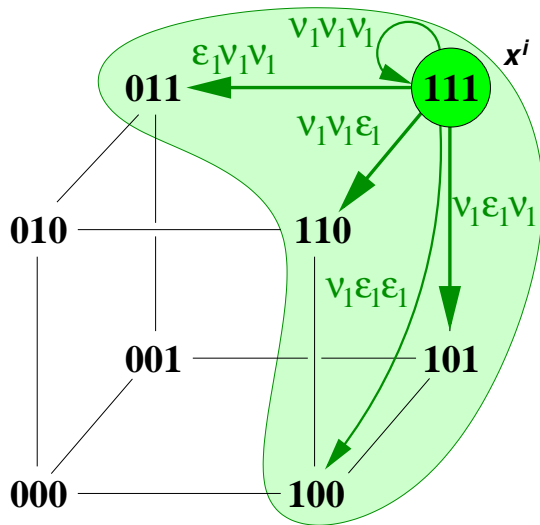
Definition of “consistent decoding” states a related monotonicity for decoding probabilities and sets of tied states:

$$i \in \{k \in \Omega \mid y' \in Y_k\} \subseteq \{k \in \Omega \mid y \in Y_k\}$$

$$\Rightarrow d(y', i) \geq d(y, i)$$

Monotone decoding

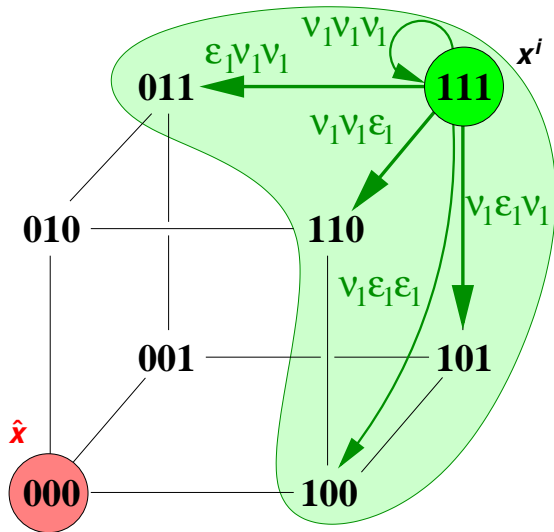
$$p(y \in Y_i | x^i) = \varepsilon_1 \nu_1 \nu_1 + \nu_1$$



Monotone decoding, consider deviation from x^i to \hat{x}

$$p(y \in Y_i | x^i) = \varepsilon_1 \nu_1 \nu_1 + \nu_1$$

$$p(y \in Y_i | \hat{x}) = \nu_0 \varepsilon_0 \varepsilon_0 + \varepsilon_0$$



(it suffices to consider only bits where x^i and \hat{x} differ.)

Proof of Nash property

Want

$$\begin{aligned} p(\mathbf{y} \in \mathbf{Y}_i | \mathbf{x}^i) &\geq p(\mathbf{y} \in \mathbf{Y}_i | \hat{\mathbf{x}}) \\ \varepsilon_1 \nu_1 \nu_1 + \nu_1 &\geq \nu_0 \varepsilon_0 \varepsilon_0 + \varepsilon_0 \end{aligned}$$

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Term by term?

$$\nu_1 = 1 - \varepsilon_1 > \varepsilon_0 \quad \text{yes}$$

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But **bit by bit**:

$$\begin{aligned} \varepsilon_1 \nu_1 \nu_1 + \nu_1 &= (1 - \nu_1) \nu_1 \nu_1 + \nu_1 \\ &= \nu_1 \nu_1 + \nu_1 (-\nu_1 \nu_1 + 1) \\ &> \nu_1 \nu_1 + \varepsilon_0 (-\nu_1 \nu_1 + 1) \\ &= (1 - \varepsilon_0) \nu_1 \nu_1 + \varepsilon_0 \\ &> (1 - \varepsilon_0) \varepsilon_0 \nu_1 + \varepsilon_0 \\ &> (1 - \varepsilon_0) \varepsilon_0 \varepsilon_0 + \varepsilon_0 \\ &= \nu_0 \varepsilon_0 \varepsilon_0 + \varepsilon_0 \end{aligned}$$

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... can be done generally

Proof of Nash property

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... can be done generally, even with **different errors** per bit.

Consistent decoding too strong?

Consistent decoding

$$i \in \{k \in \Omega \mid y' \in Y_k\} \subseteq \{k \in \Omega \mid y \in Y_k\}$$

$$\Rightarrow d(y', i) \geq d(y, i)$$

Consistent decoding too strong?

Consistent decoding implies

$$i \in \{k \in \Omega \mid y' \in Y_k\} = \{k \in \Omega \mid y \in Y_k\}$$

$$\Rightarrow d(y', i) = d(y, i)$$

same sets of tied states \Rightarrow same decoding probabilities

An ambiguous code

Same codeword for both states

\Rightarrow received \mathbf{y} is completely uninformative

An ambiguous code

Same codeword for both states

⇒ received \mathbf{y} is completely uninformative

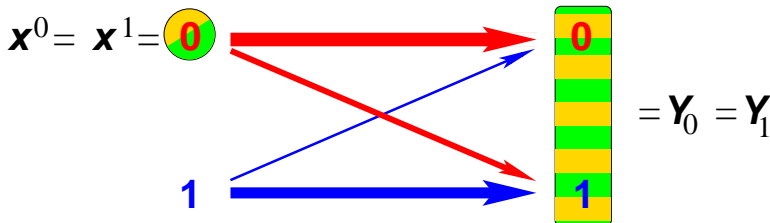
[*sarcasm = the gap between the sender making a sarcastic remark and the receiver who does not get it*]

An ambiguous code

Same codeword for both states

⇒ received \mathbf{y} is completely uninformative

⇒ consistent decoding must not distinguish received signals

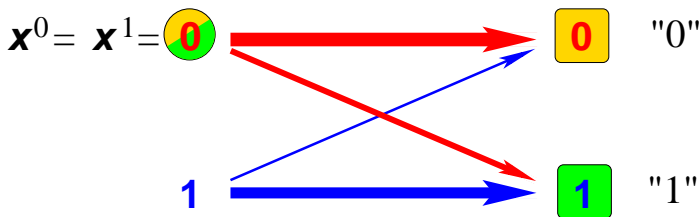


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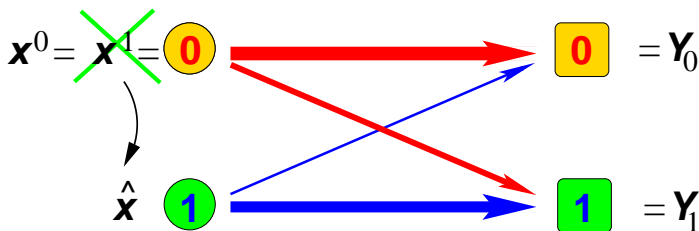
Inconsistent tie breaking

An ambiguous code

Same codeword for both states

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\Rightarrow consistent decoding must not distinguish received signals



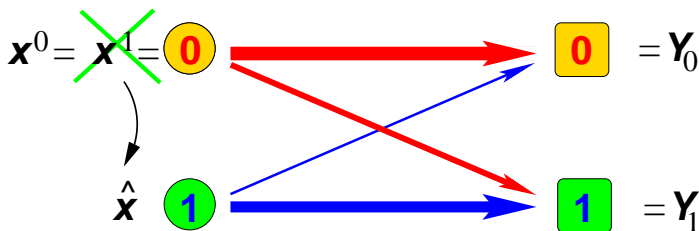
Inconsistent tie breaking \Rightarrow sender deviates

An ambiguous code ... may evolve?

Same codeword for both states

⇒ received \mathbf{y} is completely uninformative

⇒ consistent decoding must not distinguish received signals



Inconsistent tie breaking ⇒ sender deviates ... to better code.

Over-interpreting **ambiguous** signals allows codes to **evolve**?

Questions – answers

1. Is every code a Nash code? – no
2. Is some code a Nash code? – yes, receiver-optimal code is Nash
3. Do small alphabets allow for more Nash codes? – yes, every consistently decoded binary code is Nash

Questions – answers – more questions

1. Is every code a Nash code? – no
2. Is some code a Nash code? – yes, receiver-optimal code is Nash
3. Do small alphabets allow for more Nash codes? – yes, every consistently decoded binary code is Nash
4. Future topic:
noisy channel as model of **ambiguity**
⇒ sender may **deviate**
⇒ let code **evolve**

Nash-stable channels

Definition : A channel (defined by its transition probabilities) is **Nash-stable** if, for **any** generic prior, **any** assignment of states to channel inputs defines a Nash code.

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Example : binary channel.

Theorem : The product of Nash-stable channels (with independent errors) is Nash-stable.

Question : Computational complexity of recognizing that a channel is Nash-stable.

A channel that is not Nash-stable

$q_i V_i$	$p(y x)$	y		
		0	1	2
3.0	0	0.7	0.15	0.15
2.0	1	0.25	0.5	0.25
	2	0.2	0.2	0.6

A new Nash-stable channel

$q_i V_i$		$p(y x)$	y		
			0	1	2
x	0	4/7	1/7	2/7	
	1	2/7	4/7	1/7	
	2	1/7	2/7	4/7	

A new Nash-stable channel

$q_i V_i$		$p(y x)$	y		
			0	1	2
1.0	0	4/7	1/7	2/7	
	x 1	2/7	4/7	1/7	
1.9	2	1/7	2/7	4/7	

A new Nash-stable channel

$q_i V_i$		$p(y x)$	y		
			0	1	2
1.0	0	$4/7$	$1/7$	$2/7$	
	x 1	$2/7$	$4/7$	$1/7$	
2.0	2	$1/7$	$2/7$	$4/7$	

A new Nash-stable channel

forbidden : non-generic prior with non-monotonic decoding

$q_i V_i$		$p(y x)$	y		
			0	1	2
1.0	0	4/7	1/7	2/7	
	x 1	2/7	4/7	1/7	
2.0	2	1/7	2/7	4/7	

A new Nash-stable channel

$q_i V_i$		$p(y x)$	y		
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1.0 2.1	x 0		4/7	1/7	2/7
	1	2/7	4/7	1/7	
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A new Nash-stable channel

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1.0	0		4/7	1/7	2/7
	1	2/7	4/7	1/7	
2.1	2	1/7	2/7	4/7	

Does it suffice to test **two** states and their possible priors as channel inputs?

This can be done in polynomial time.

Or is recognizing Nash-stability co-NP-complete?

Thank you!