

Comparison of Terminated and Tailbiting Spatially Coupled LDPC Codes With Optimized Bit Mapping for PM-64-QAM

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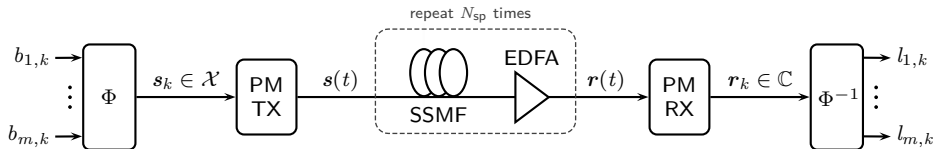
Main Result

Unequal error protection of a nonbinary modulation format can be used to **significantly improve performance of tailbiting SC-LDPC codes**. Comparable gap to capacity at a lower FEC overhead.

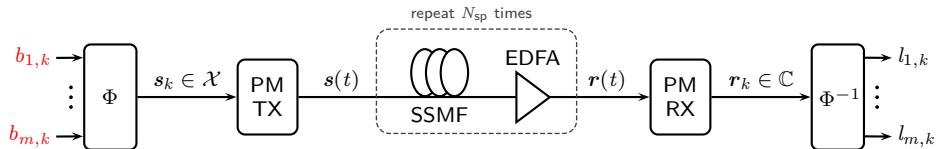
Outline

1. System Model
2. SC-LDPC Codes
3. Bit Mapper Optimization
4. Results
5. Conclusions

System Model

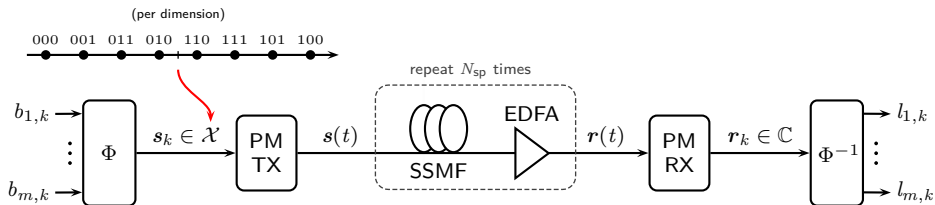


System Model



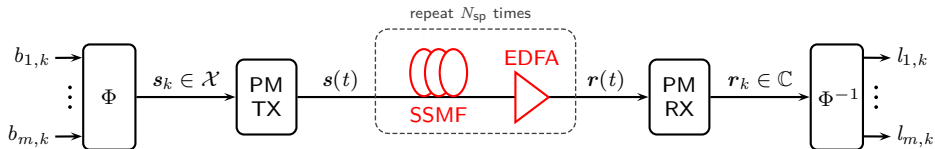
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System Model



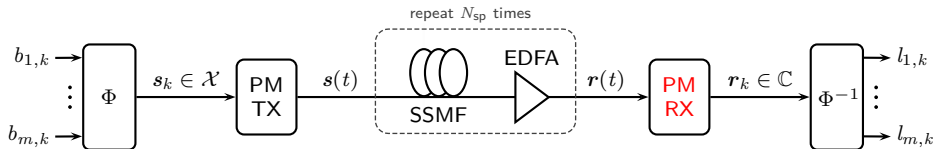
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System Model



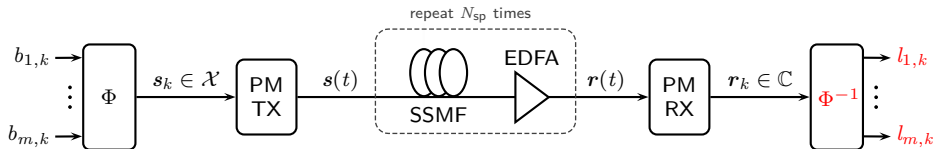
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- Demodulator Φ^{-1} : **log-likelihood ratio (LLR) computation**

Spatially Coupled LDPC Codes

- Can be represented in terms of a protograph = **prototype graph**

Example:

Terminated

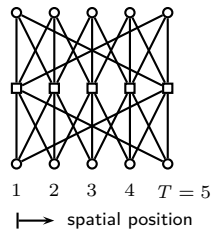
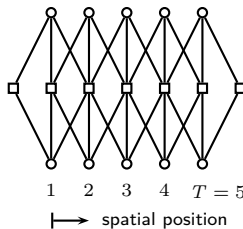
Tailbiting

Example:

Terminated

Tailbiting

protograph

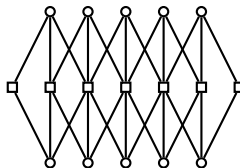


Example:

Terminated

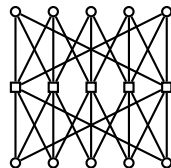
Tailbiting

protograph



base matrix

$$\begin{pmatrix} 1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 \end{pmatrix}$$

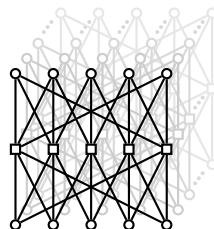
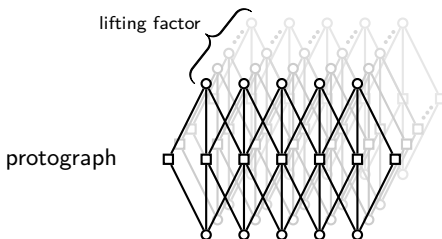


$$\begin{pmatrix} 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 \end{pmatrix}$$

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Terminated

Tailbiting



base matrix

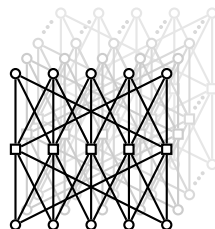
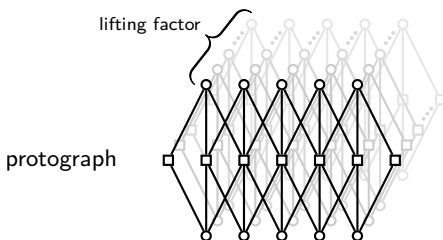
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Example:

Terminated

Tailbiting

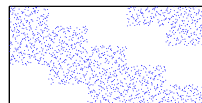
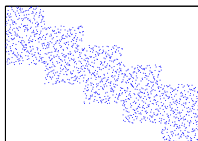


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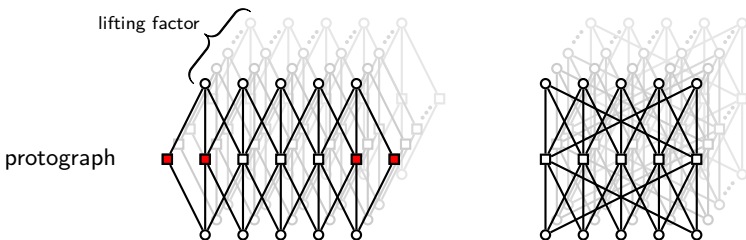
parity-check matrix



Example:

Terminated

Tailbiting



check node degrees

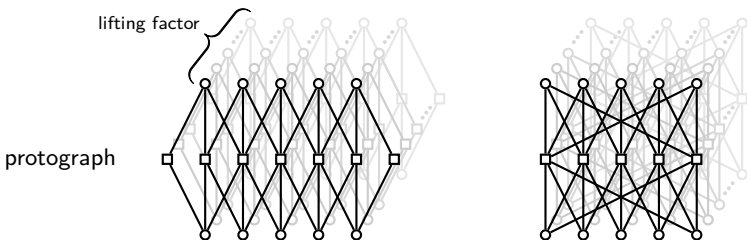
slightly irregular

regular

Example:

Terminated

Tailbiting



protograph

lifting factor

check node degrees

slightly irregular

regular

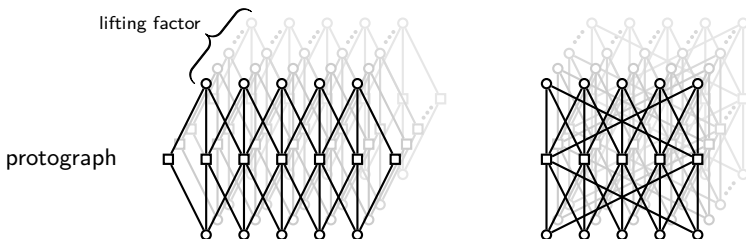
performance

capacity-approaching
(wave effect)comparable to regular LDPC
(no wave effect)

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performance

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rate

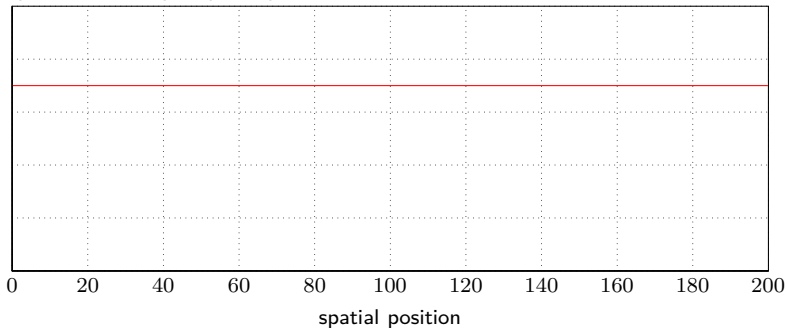
$$R(T) = R - R_{\text{loss}}(T)$$

$$R_{\text{loss}}(T) \rightarrow 0 \text{ as } T \rightarrow \infty$$

$$R \text{ (no rate loss)}$$

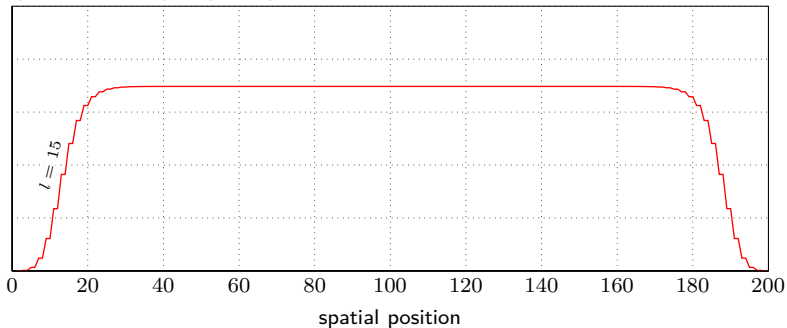
Decoding Wave

predicted BER per spatial position



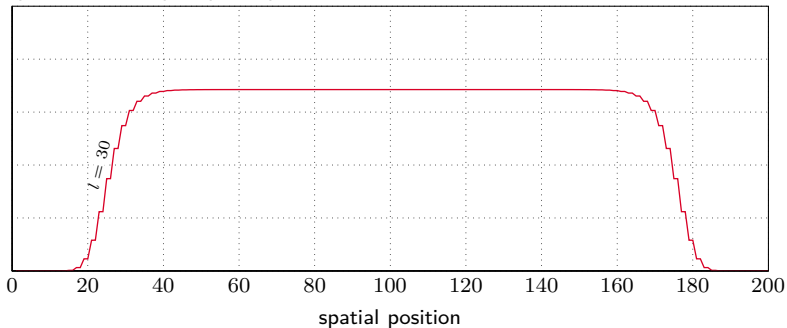
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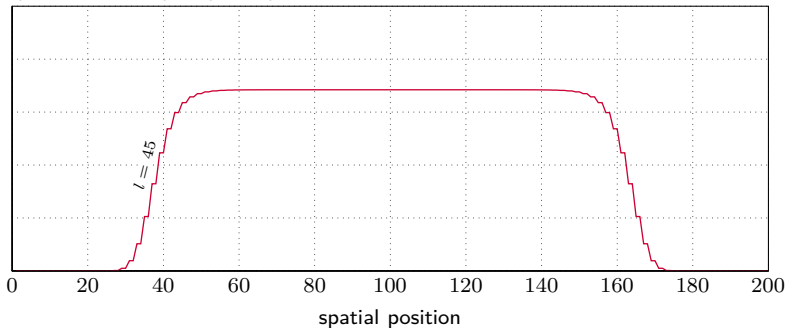
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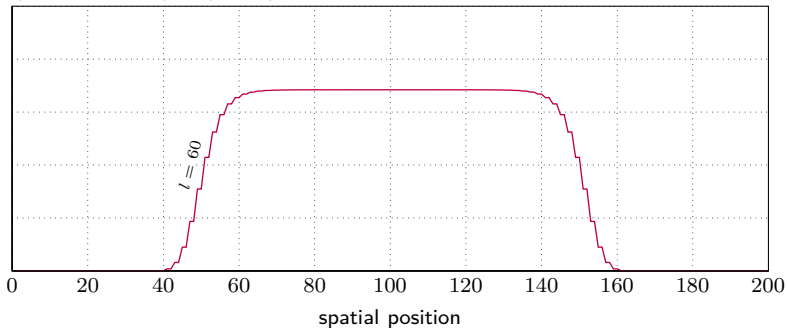
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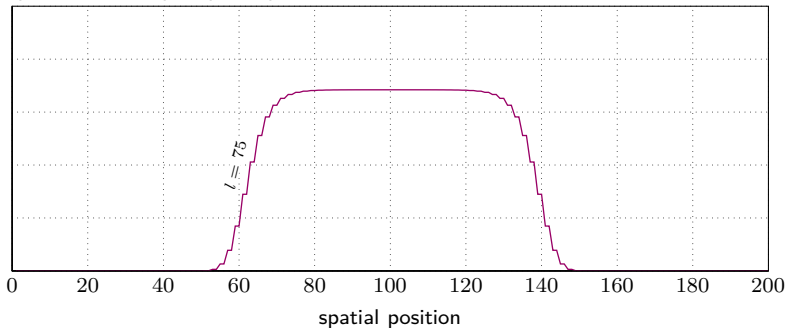
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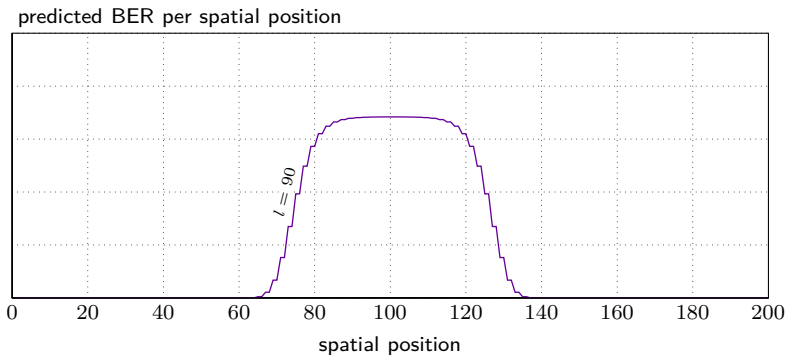


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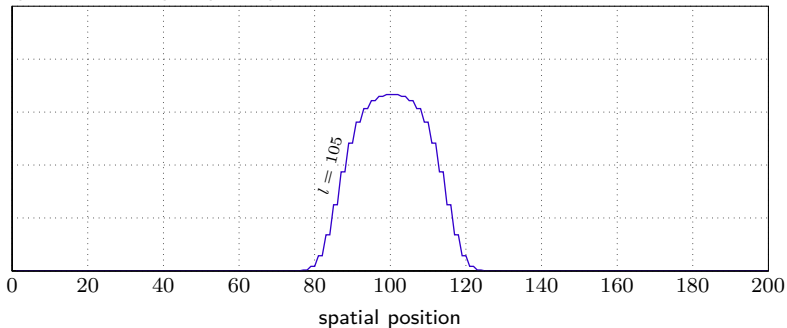


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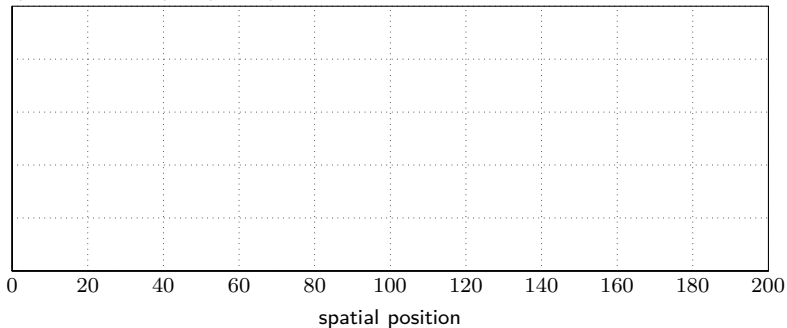
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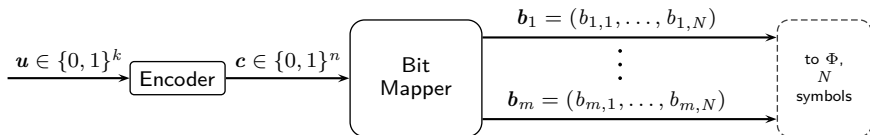
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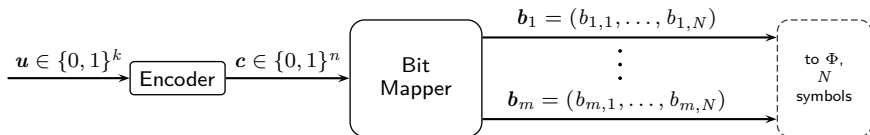


Successful decoding!

Bit Mapper

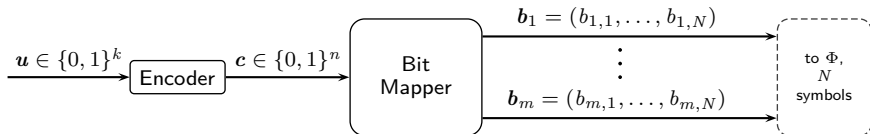


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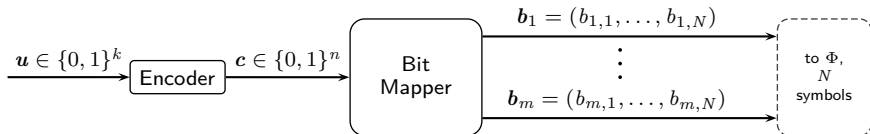
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Bit Mapper



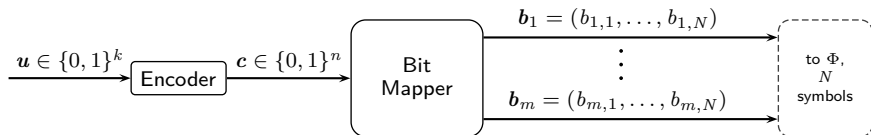
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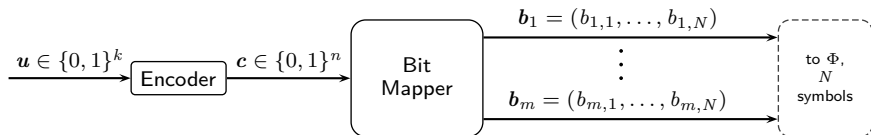
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- \mathbf{A} is **optimized based on modified protograph extrinsic transfer function (P-EXIT) analysis** (predicts BER for $M \rightarrow \infty$)

Optimization Results

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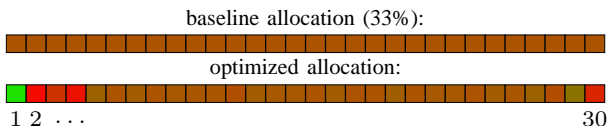
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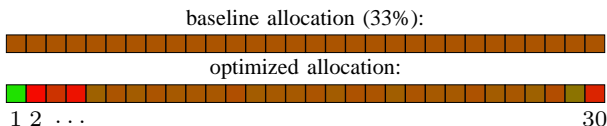
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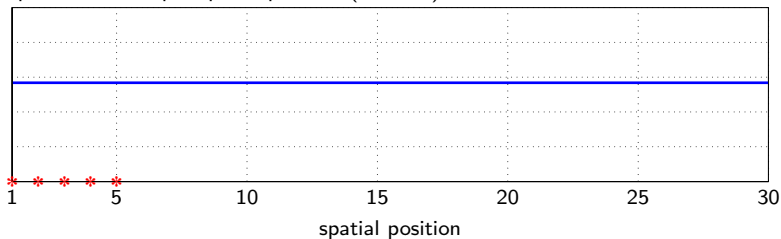
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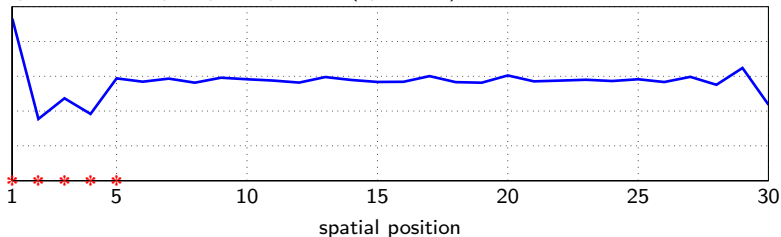
- **Locally improved decoding convergence** in the first spatial position **leads to wave-like decoding behavior**, similar to terminated SC-LDPC codes

Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

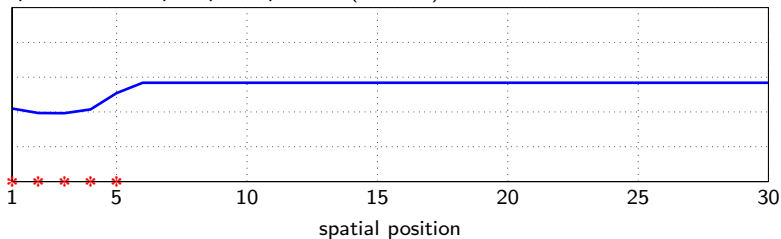


predicted BER per spatial position (optimized)

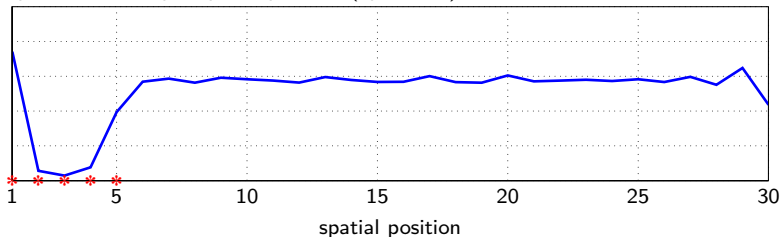


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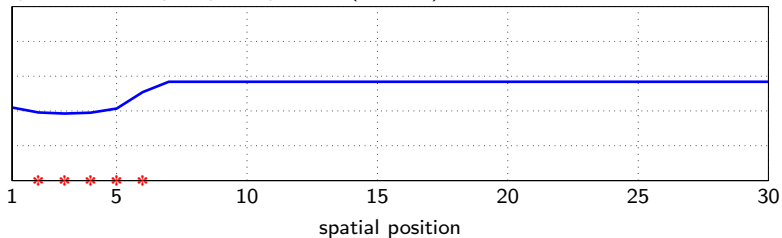


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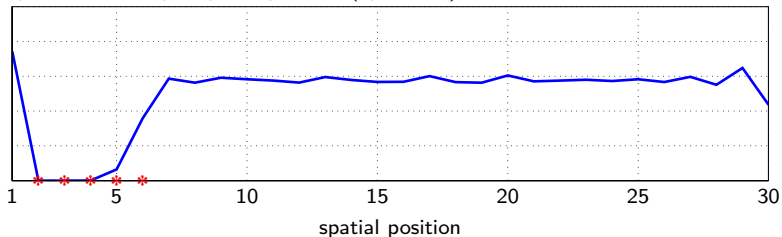


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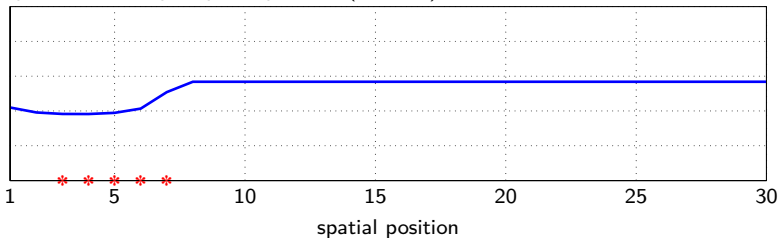


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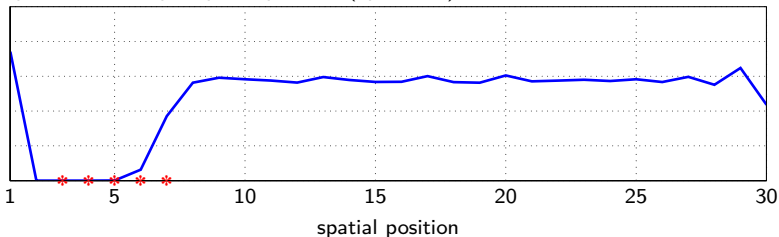


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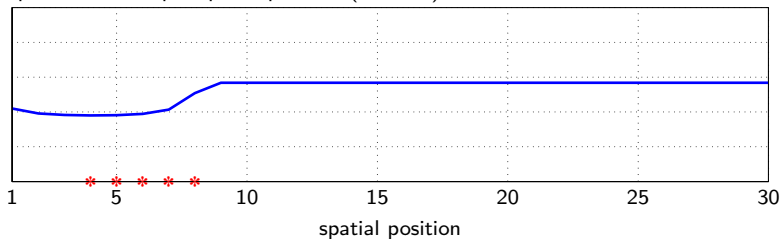


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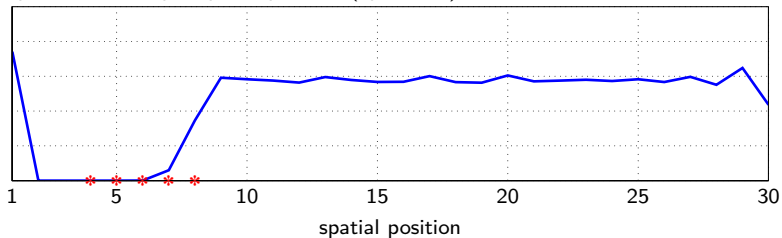


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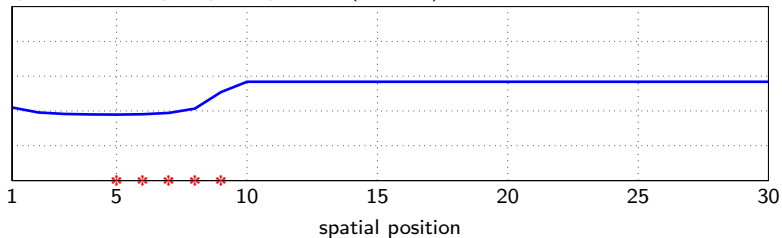


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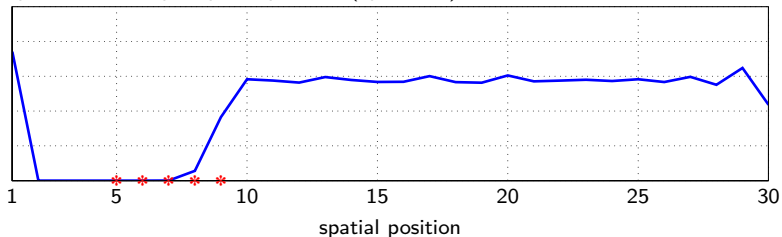


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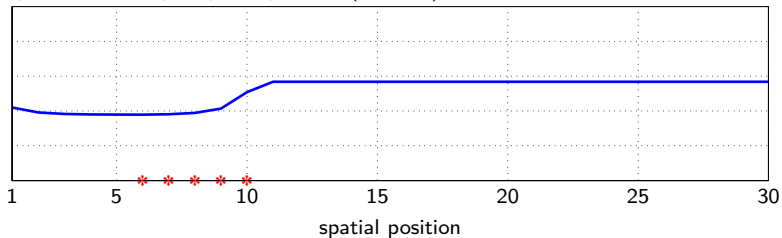


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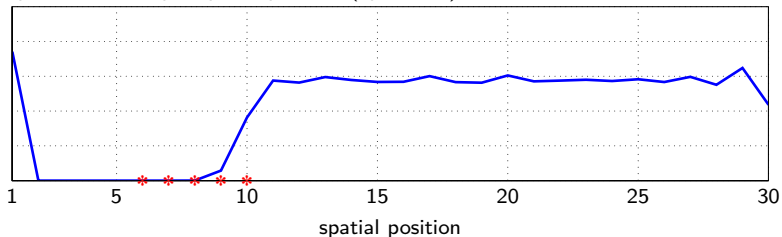


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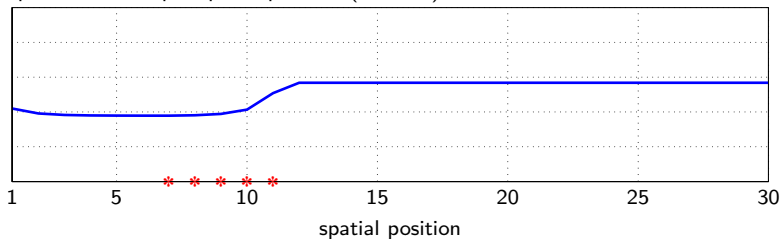


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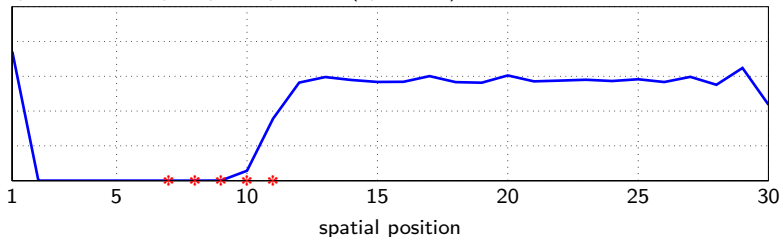


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

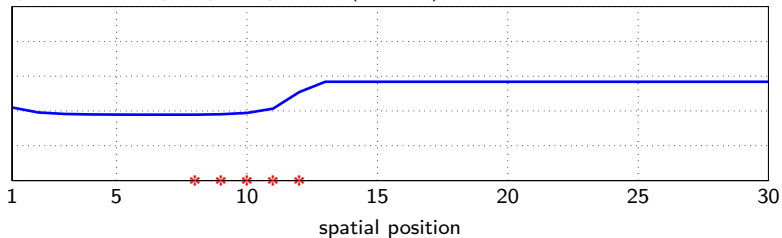


predicted BER per spatial position (optimized)

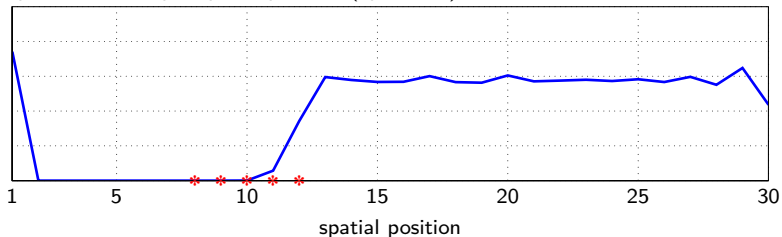


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

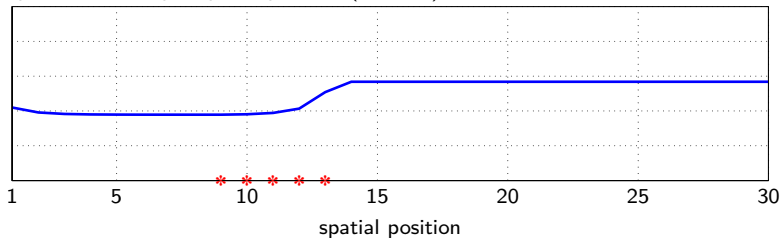


predicted BER per spatial position (optimized)

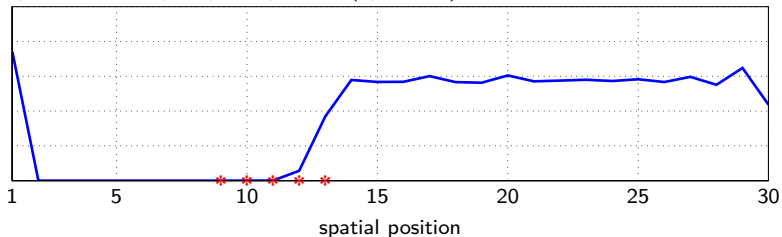


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

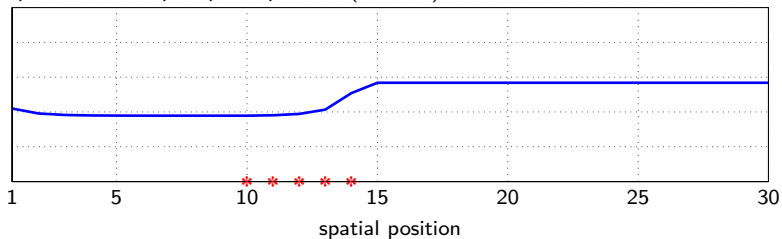


predicted BER per spatial position (optimized)

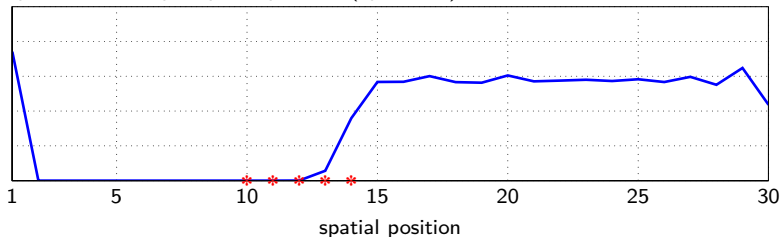


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

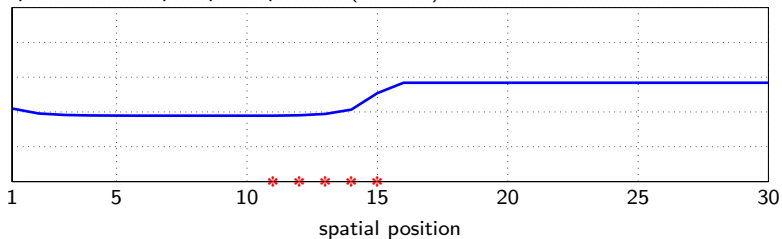


predicted BER per spatial position (optimized)

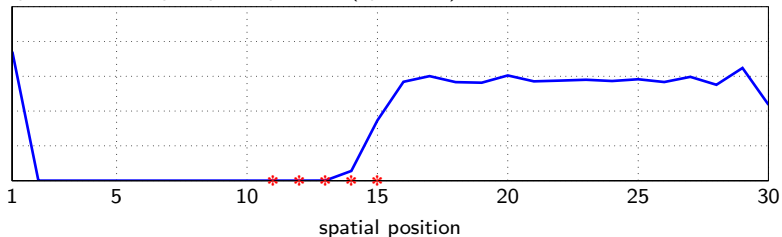


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

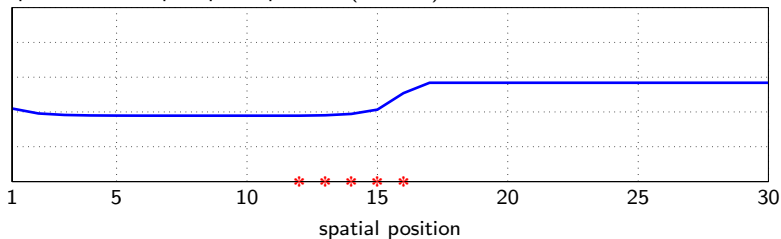


predicted BER per spatial position (optimized)

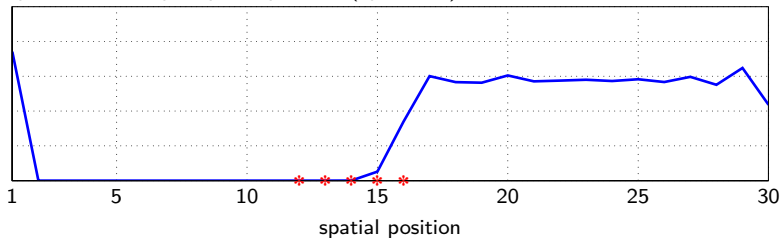


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

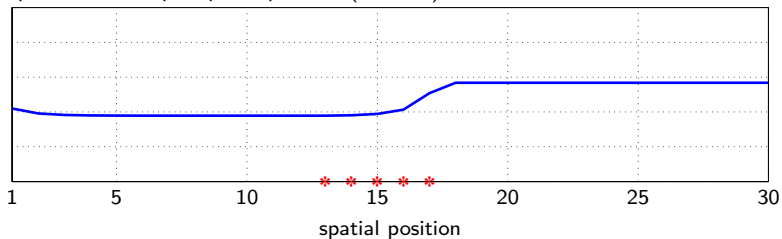


predicted BER per spatial position (optimized)

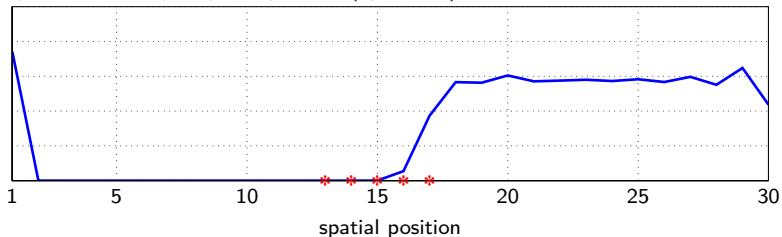


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

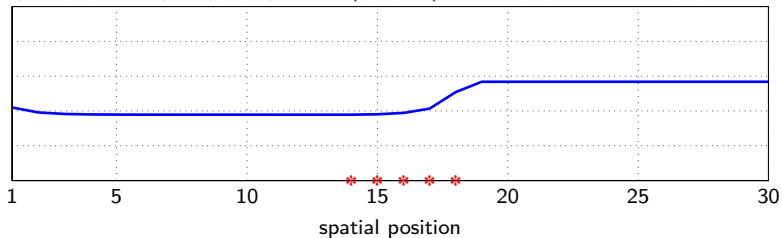


predicted BER per spatial position (optimized)

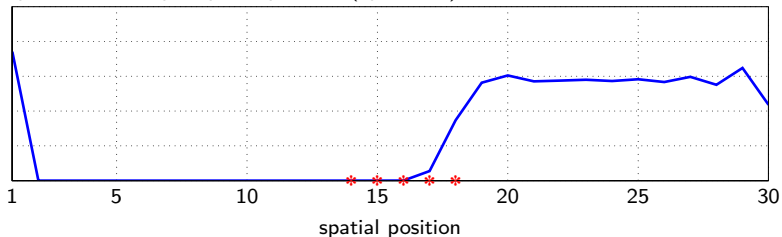


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

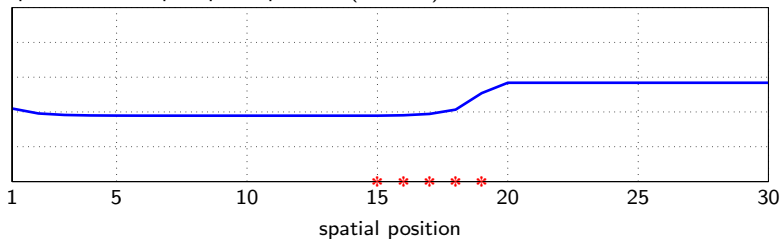


predicted BER per spatial position (optimized)

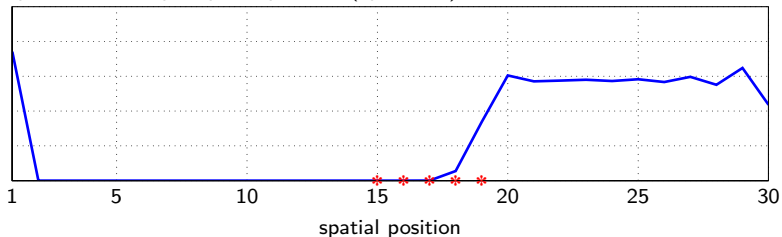


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

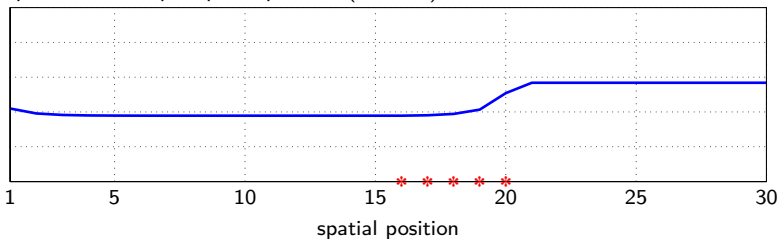


predicted BER per spatial position (optimized)

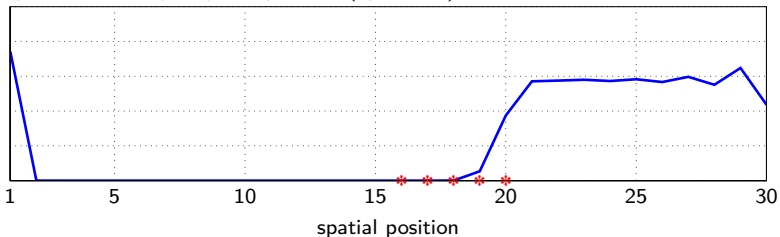


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

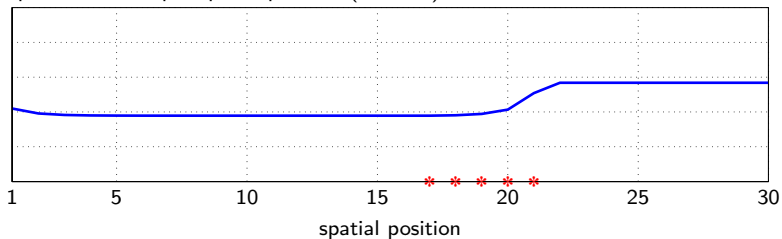


predicted BER per spatial position (optimized)

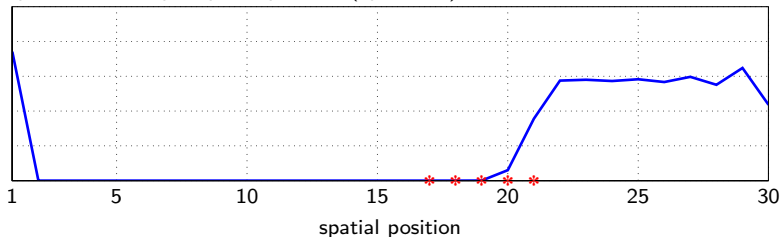


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

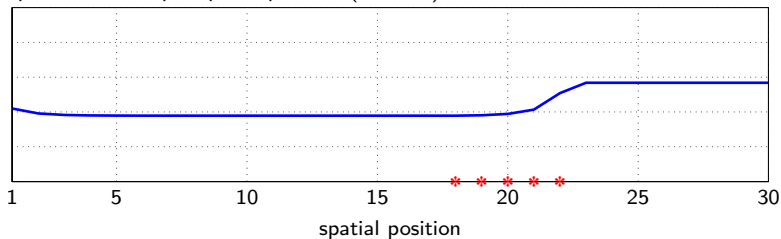


predicted BER per spatial position (optimized)

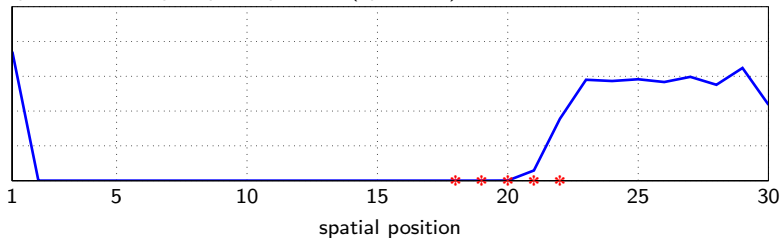


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

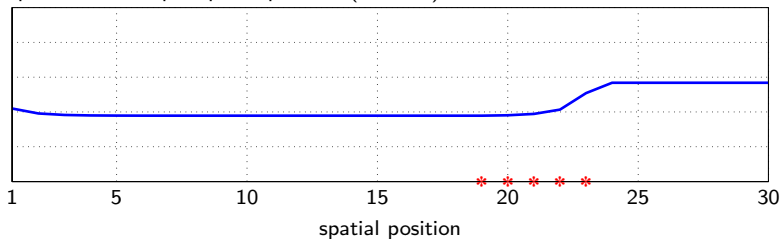


predicted BER per spatial position (optimized)

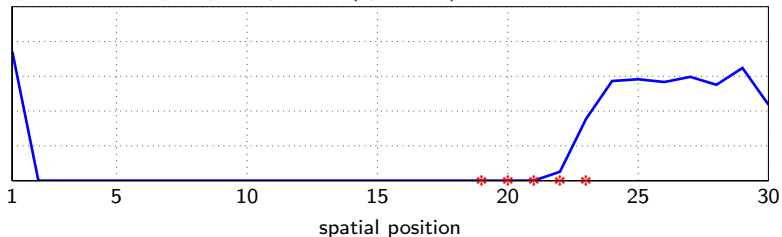


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

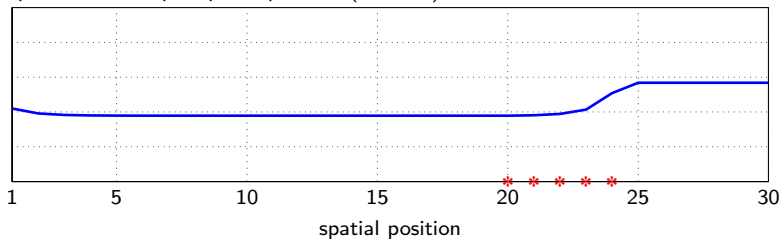


predicted BER per spatial position (optimized)

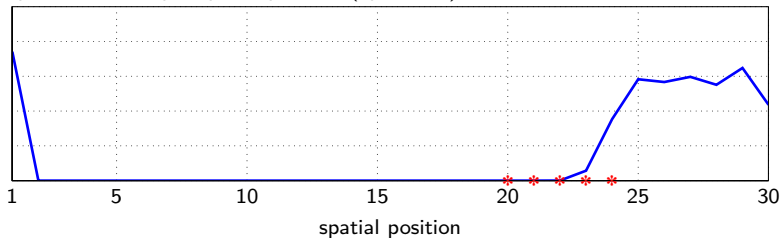


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predicted BER per spatial position (baseline)

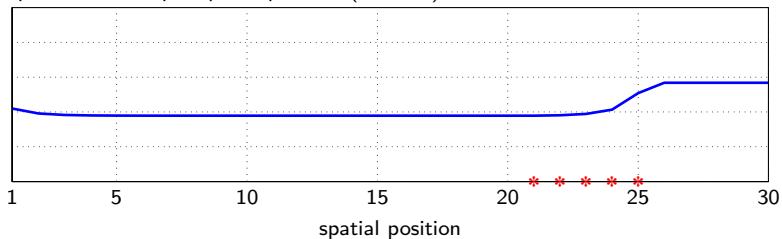


predicted BER per spatial position (optimized)

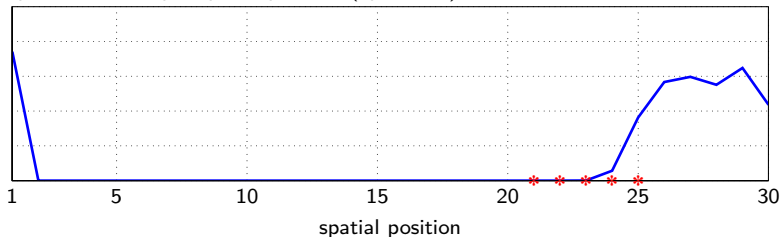


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predicted BER per spatial position (baseline)

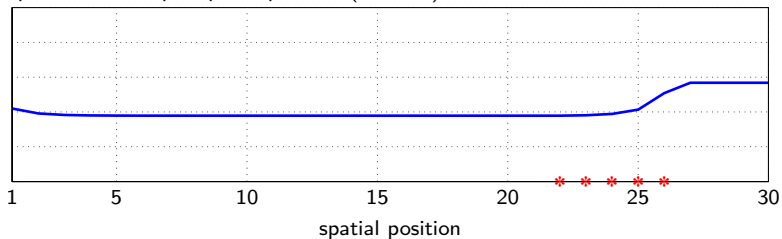


predicted BER per spatial position (optimized)

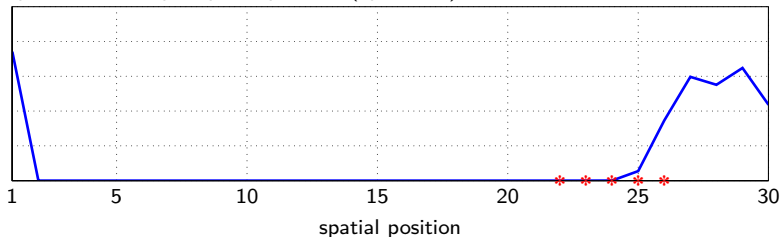


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

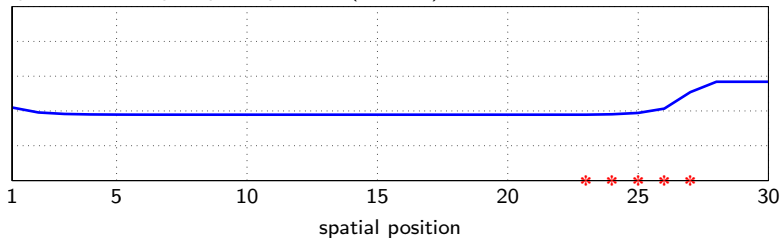


predicted BER per spatial position (optimized)

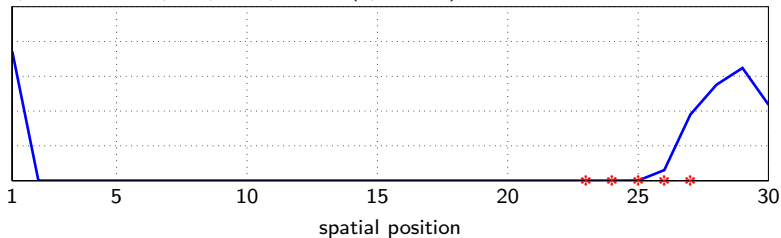


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predicted BER per spatial position (baseline)

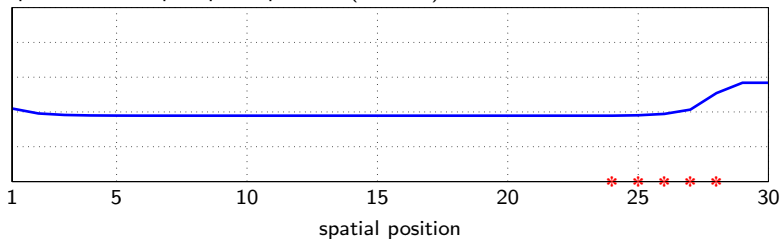


predicted BER per spatial position (optimized)

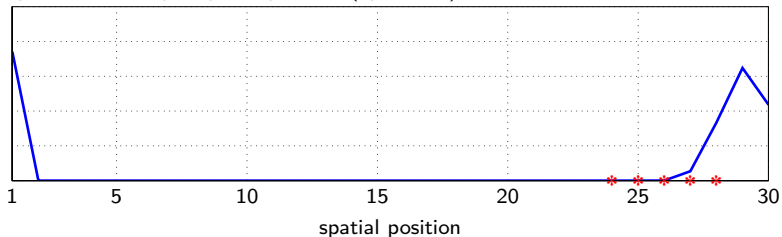


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predicted BER per spatial position (baseline)

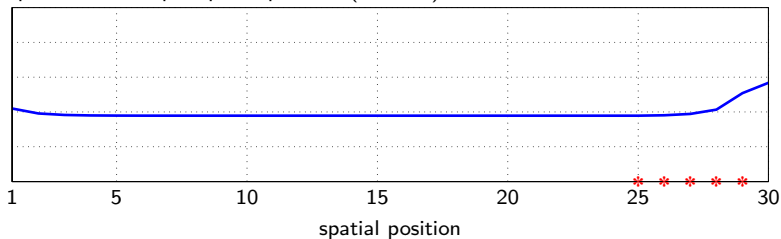


predicted BER per spatial position (optimized)

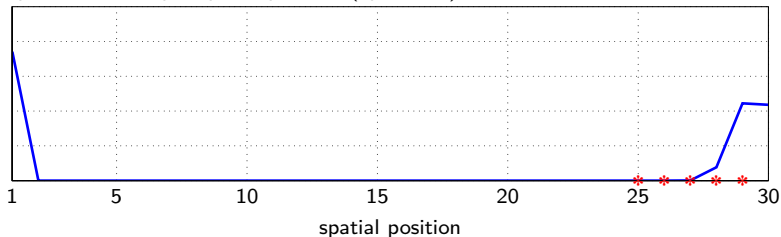


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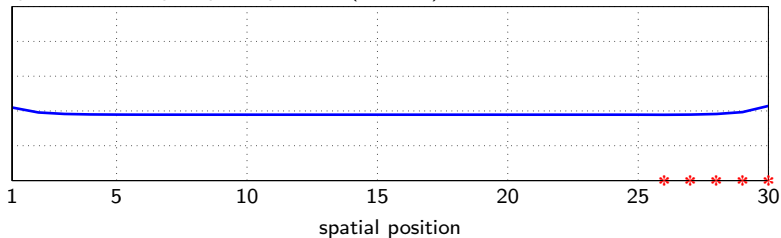


predicted BER per spatial position (optimized)

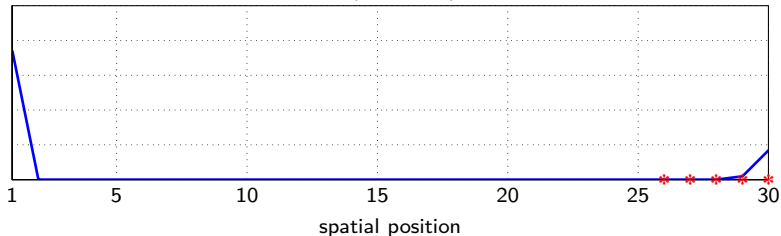


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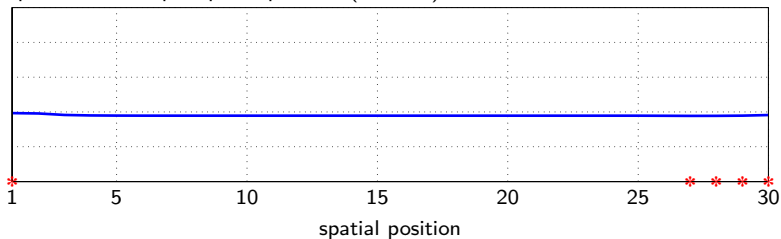


predicted BER per spatial position (optimized)

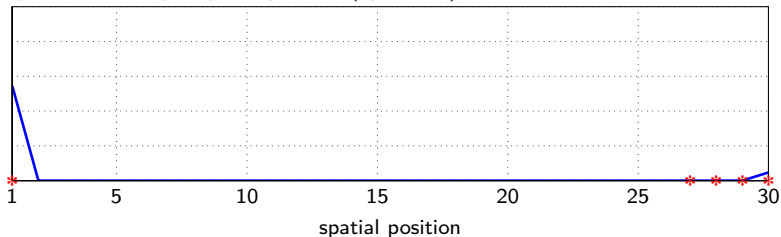


Decoding Behavior For The Same SNR

predicted BER per spatial position (baseline)

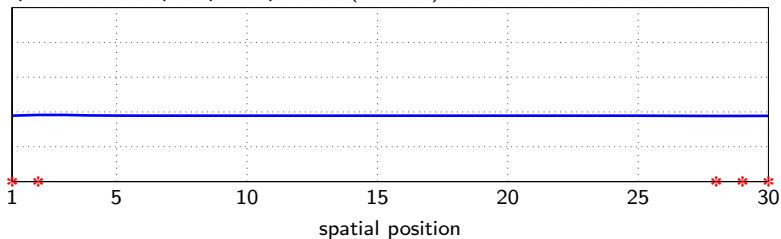


predicted BER per spatial position (optimized)

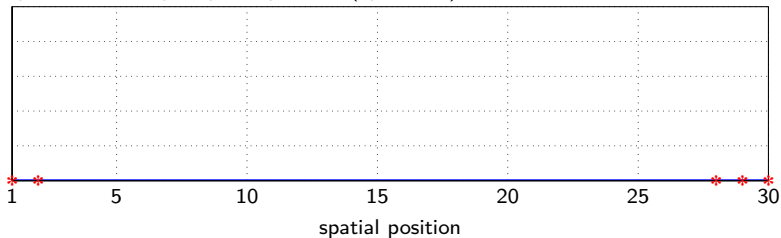


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predicted BER per spatial position (baseline)

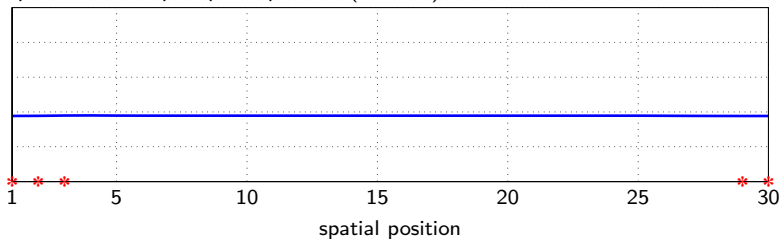


predicted BER per spatial position (optimized)

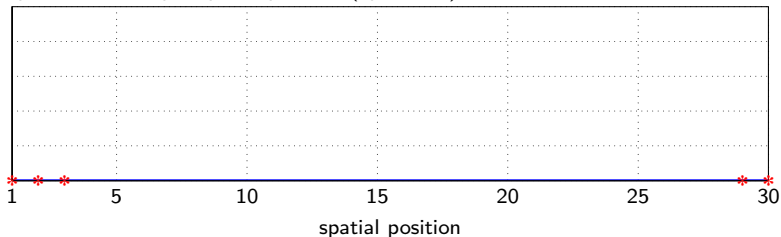


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predicted BER per spatial position (baseline)

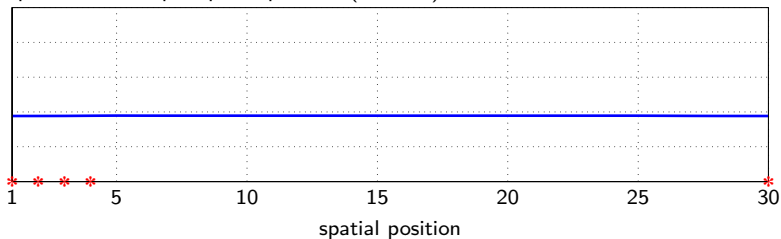


predicted BER per spatial position (optimized)

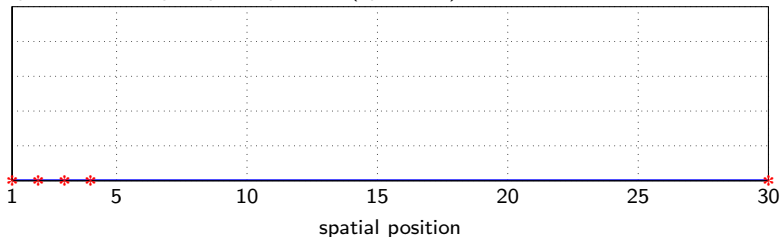


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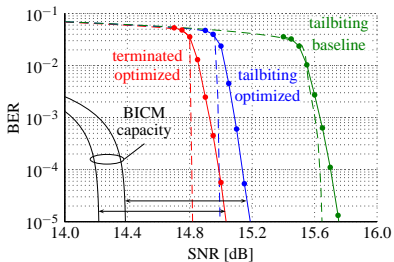


predicted BER per spatial position (optimized)

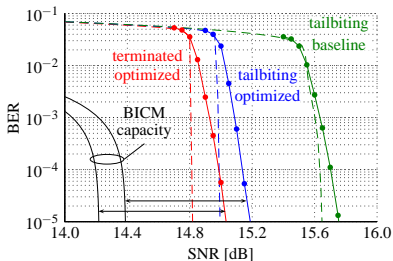


Simulation Results

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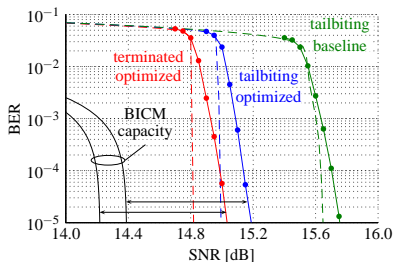


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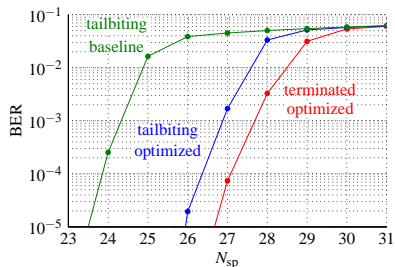
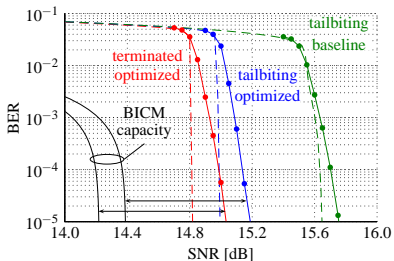
- Gain of ≈ 0.55 dB at a BER of 10^{-5} for AWGN channel

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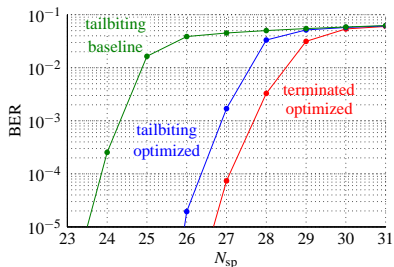
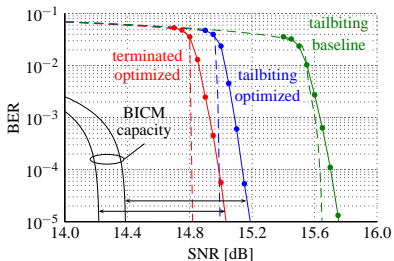
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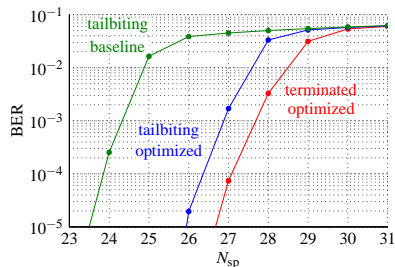
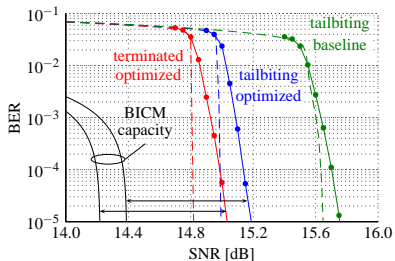
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Thank you!

