



AI4CODE



ANR-19-CE25-0013-01
ANR-21-CE25-0006

C4-Sequences: Rate Adaptive Coded Modulation for Few Bits Message

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Outline



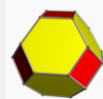
Summary of Marchand's presentation



"Sting art" sequences



C4 sequences



Geometrical shaping



Coded modulation



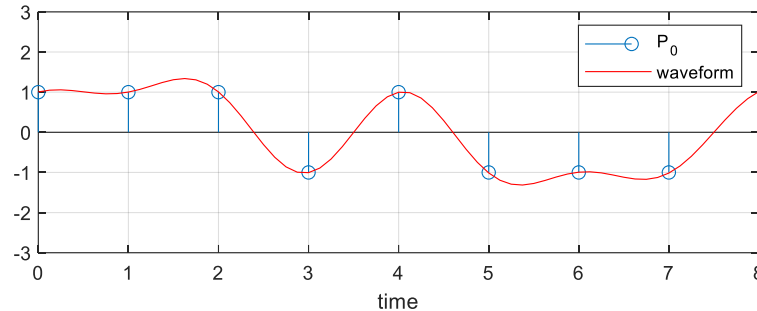
Binary Cyclic Code Shift Keying modulation

$P_0 = 11101000$ + BPSK modulation, $q = 8$, $m = 3$ bits per CCSK symbol.

• CCSK modulation:

- $P_0 = 11101000$
- $P_1 = 01110100$
- $P_2 = 00111010$
- $P_3 = 00011101$
- $P_4 = 10001110$
- $P_5 = 01000111$
- $P_6 = 10100011$
- $P_7 = 11010001$

Code rate 3/8



Binary message : 011001100

Make 3-uplet symbols: $(011)_2(001)_2(100)_2$

Take decimal value: 3 1 4

Associate CCSK symbol P_3 P_1 P_4

Send => 000111010111010010001110



[1] G.M. Dillard et al. « Cyclic code shift keying: a low probability of intercept communication technique.» IEEE Trans. on Aerospace and Electronic Systems, 39(3):786–798, 2003.



More about CCSK

Element of the coding sequence are called “chip”

CCSK not restricted to BPSK modulation [1]:

8-PSK, 16-QAM, 64-APSK can be used to encode the chips.

Truncate the CCSK sequence to increase the code rate [1]:

Example: send only first $l = 5$ chips, instead of the whole sequence.

Binary message : 011001100
 Make 3-uplet symbols: $(011)_2(001)_2(100)_2$
 Take decimal value: 3 1 4
 Associate CCSK symbol P_3 P_1 P_4
 Send => 000111010111010010001110
 • => 00011- - -01110- - -10001- - -
 • => 000110111010001

Code rate 3/5

[1] G.M. Dillard et al. « Cyclic code shift keying: a low probability of intercept communication technique.” IEEE Trans. on Aerospace and Electronic Systems, 39(3):786–798, 2003.



What is a good CCSK sequence?

- Notation: $\mathbf{x} = (x(0), x(1), \dots, x(q-1))$ a complex CCSK sequence with $\|\mathbf{x}\|^2 = q$ (energy of 1 in average per chip).
- From $\mathbf{x} \Rightarrow$ define a codebook of q sequences $\mathbf{x}_a = (x(a), x(a+1), \dots, x(a+q-1))$ (here, left rotation, with index operation done modulo q).

Minimum distance of the code: $D_m^2 = \min_{a \neq b} \|\mathbf{x}_a - \mathbf{x}_b\|^2$

$$\|\mathbf{x}_a - \mathbf{x}_b\|^2 = \|\mathbf{x}_a\|^2 + \|\mathbf{x}_b\|^2 - 2 \operatorname{Real}(\langle \mathbf{x}_a, \mathbf{x}_b \rangle).$$

Thus : $D_m^2 = 2q - 2 \max(\operatorname{Real}(\langle \mathbf{x}_a, \mathbf{x}_b \rangle, a \neq b))$



What's about truncated CCSK sequences?

- How evolve the minimum distance when truncated sequences are used?
- Convenient to use a normalized distance, i.e., a distance per chip, i.e.

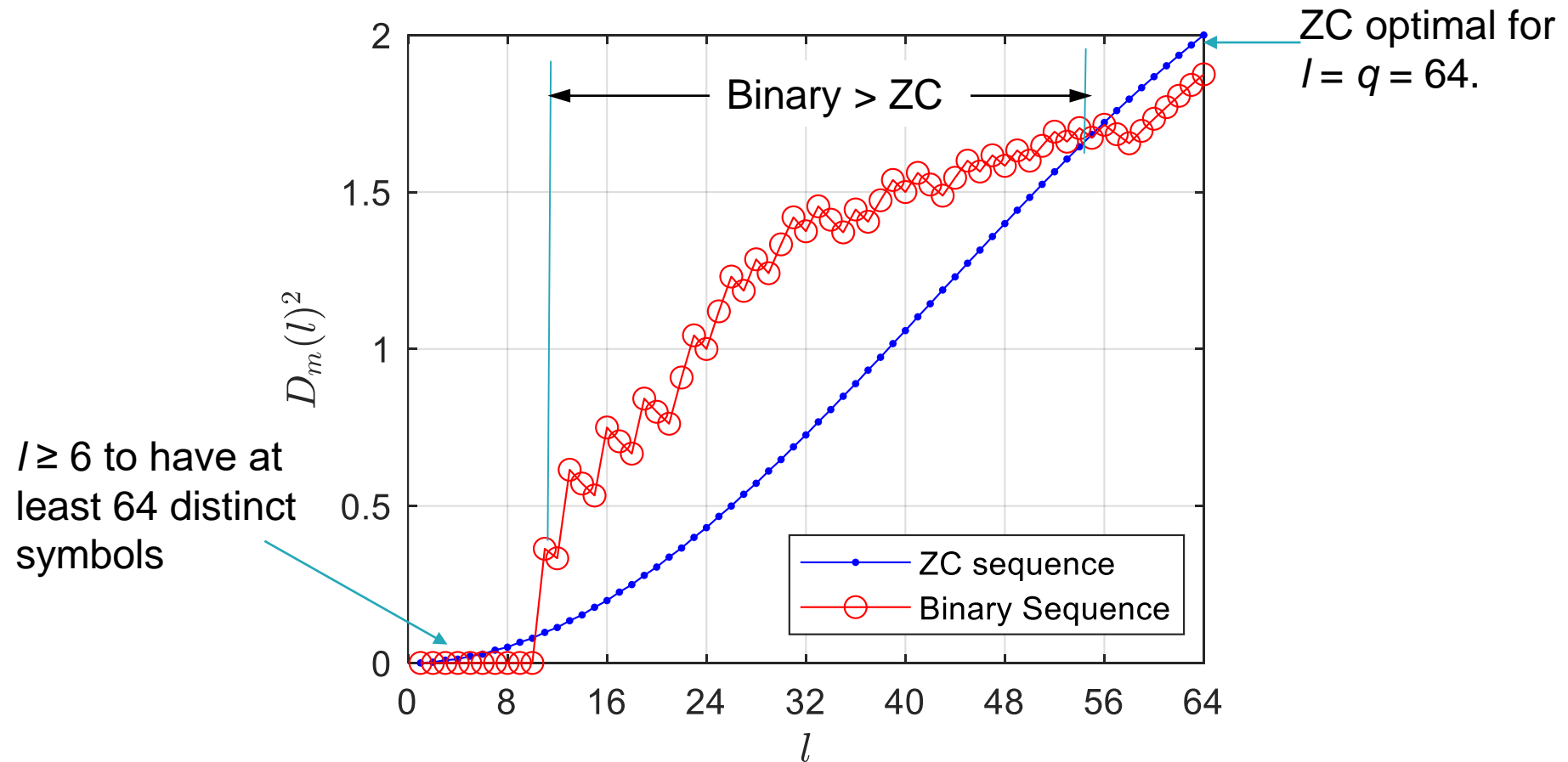
$$D_m(l)^2 = \frac{1}{l} \min \left(\|x_a^l - x_b^l\|^2, a \neq b \right)$$

- With x_a^l the length- l truncated sequence of x_a , i.e.,

$$x_a^l = (x(a), x(a + 1), \dots, x(a + l - 1))$$



Evolution of $D_m(l)$ as a function of the truncation length?



○ It is possible to do better?

Outline



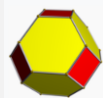
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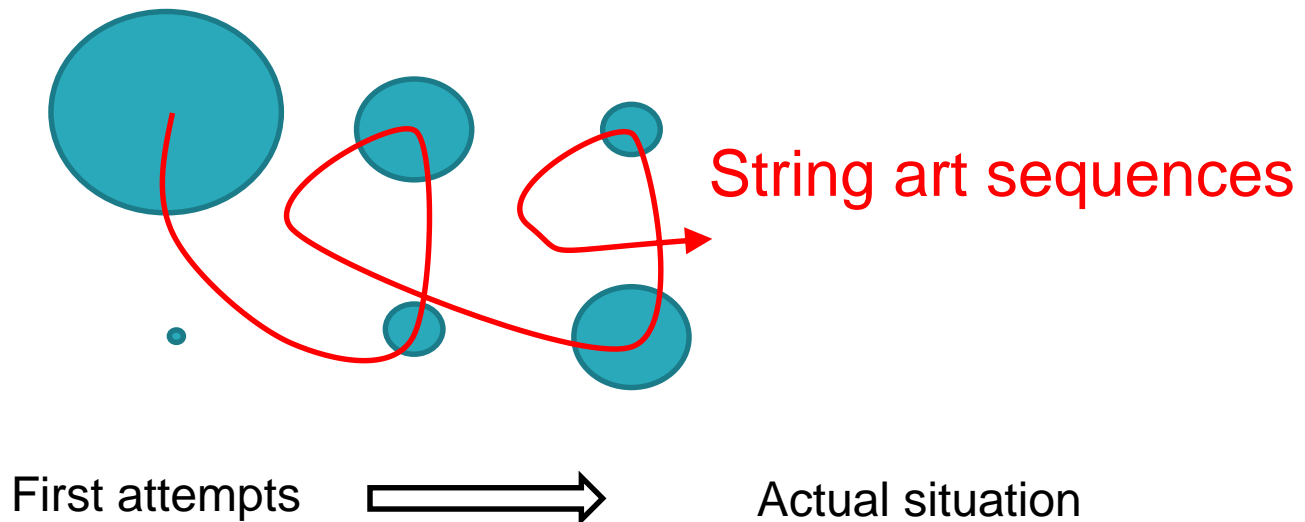
Coded modulation

Optimization of NB-CCSK sequences

- Multi-objective optimization problem: maximize D_l^2 for $l = 1, \dots, q$.

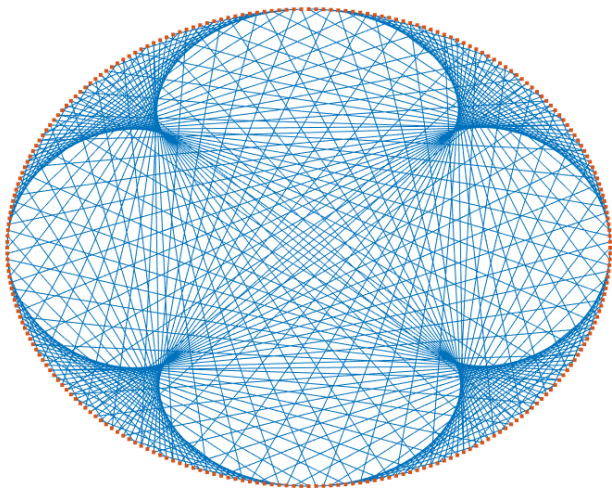
Machine Learning
Technique

Mathematical
Formalism

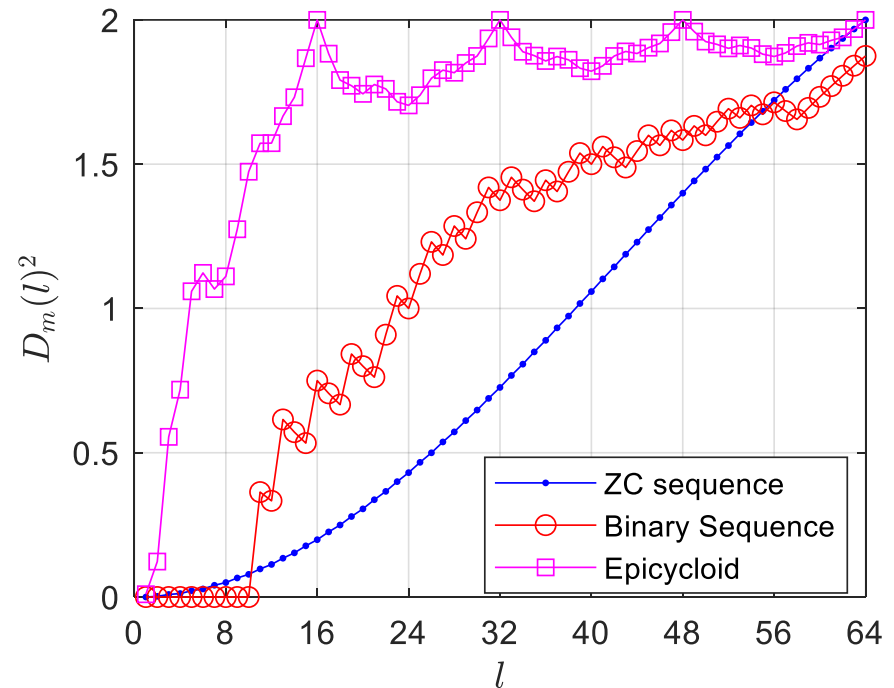


- Set of optimal solutions obtained.

Set of solutions with $D_m(l) = 2$ for several values of l .



- $\pi(i+1) = \text{mod}(5\pi(i) + 1, q)$



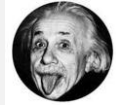
Optimal for $l = q/4, q/2, 3q/4$ and q .

Always above Binary and ZC sequences...

Outline



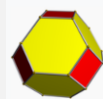
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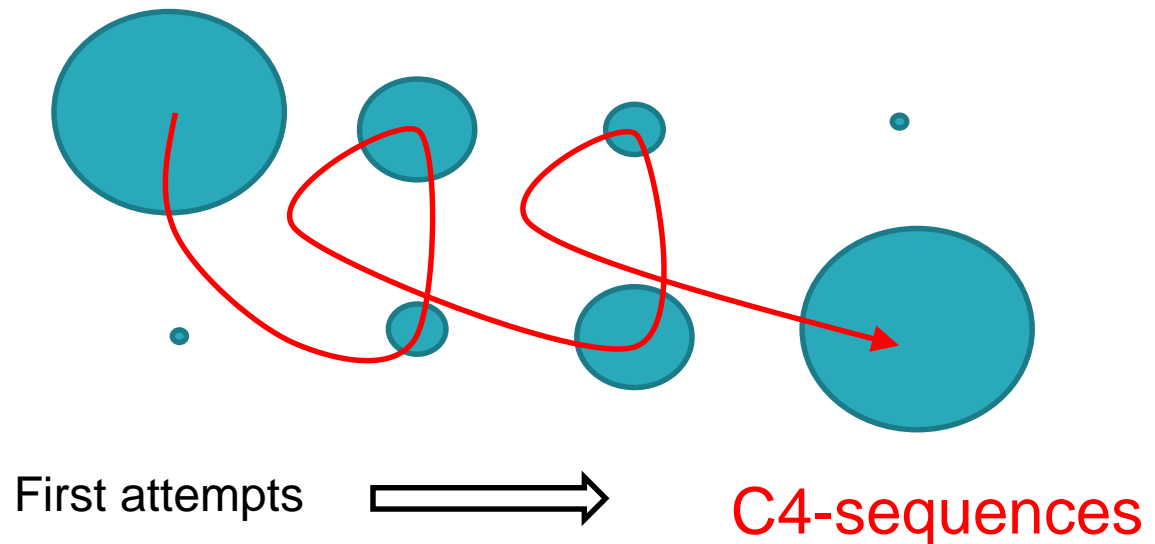
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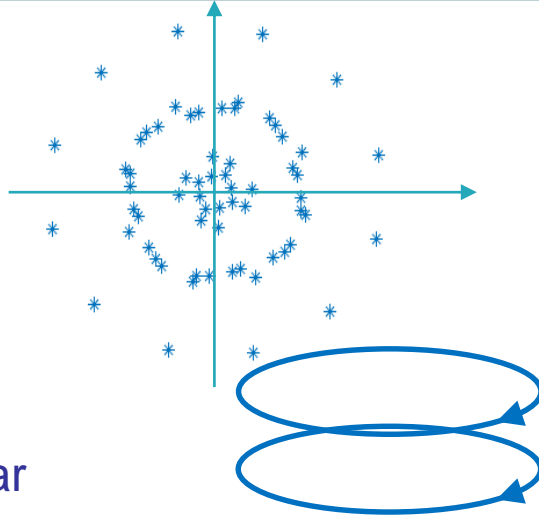


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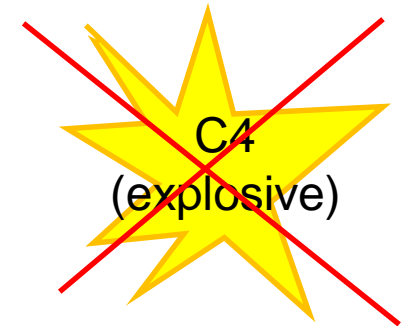


What does C4 means?

○ Constellation



○ Circular



○ (auto)-Correlation

$$\sum_{n=0}^{q-1} x(n)x(n + \tau)'$$

○ Cross

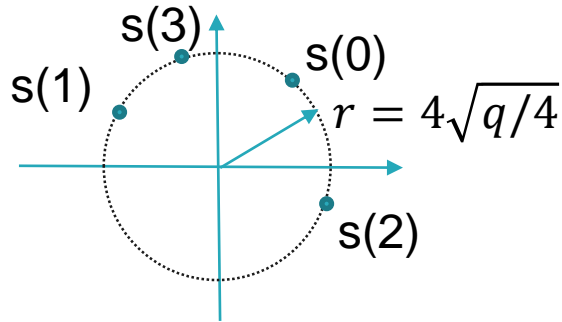


(celtic cross)

Mathematical recipe for C4-sequence

Generation of a C4 sequence of length $q = 4p$ in 3 steps.

- 1) Select randomly $q/4$ points on a circle of radius $r = 4\sqrt{q/4}$



- 2) From length $q/4$ vector \mathbf{S} , generate length q vector \mathbf{X} as

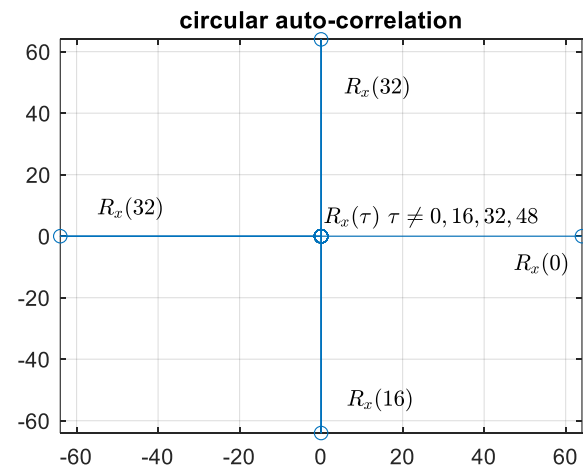
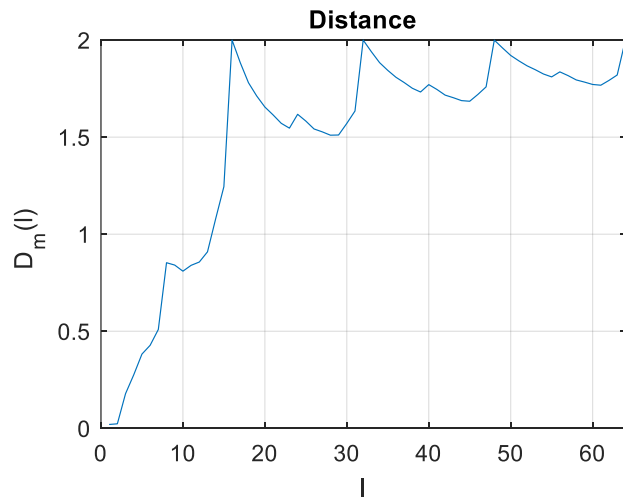
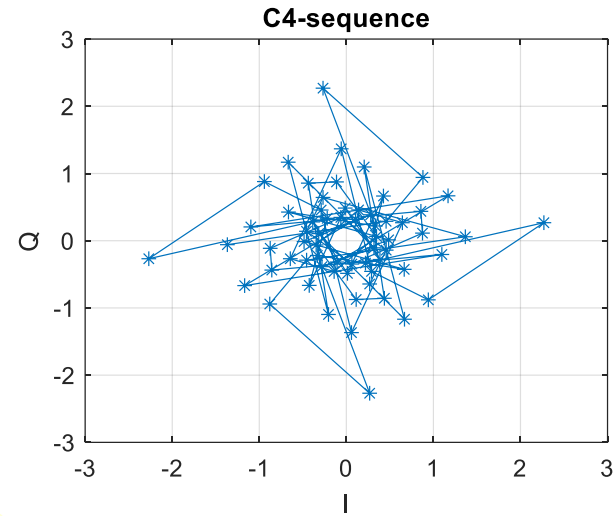
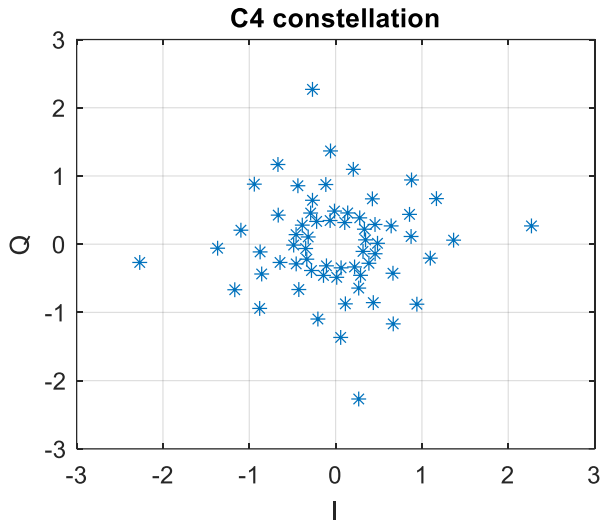
$$\mathbf{X} = [0 \ 0 \ 0 \ S(0) \ 0 \ 0 \ 0 \ S(1) \ \dots \ 0 \ 0 \ 0 \ S(q/4-1)]$$

```
Function x = random_C4(q);  
  
% Step 1  
theta = 2*pi*rand(1,q/4);  
S = 4*sqrt(q/4)*exp(1i*theta);  
  
% Step 2  
X = kron(S, [0 0 0 1]);  
  
% Step 3  
x = ifft(X);
```

- 3) Compute the Inverse Discrete Fourier Transform \mathbf{x} of \mathbf{X} , $\mathbf{x} = \text{IDFT}(\mathbf{X})$.

...and \mathbf{x} is a C4 sequence

Experimentation Results $q = 64$



Clockwise rotation



Clock-wise and Anti-clockwise C4 sequences

$q = 64;$

$\theta_1 = \text{rand}(1, q/4);$

$S_1 = 4 \cdot \sqrt{q/4} \cdot \exp(2 \cdot \pi \cdot i \cdot \theta_1);$

$X = \text{kron}(S_1, [0 \ 0 \ 0 \ 1]);$

$x = \text{ifft}(X);$

Clock-wise C4 sequence

$\theta_2 = \text{rand}(1, q/4);$

$S_2 = 4 \cdot \sqrt{q/4} \cdot \exp(2 \cdot \pi \cdot i \cdot \theta_2);$

$Y = \text{kron}(S_2, [0 \ 1 \ 0 \ 0]);$

$y = \text{ifft}(Y);$

Anti-clockwise C4 sequence

Theorem: if x is a clockwise C4-sequence and y an anti-clockwise C4-sequence, then,

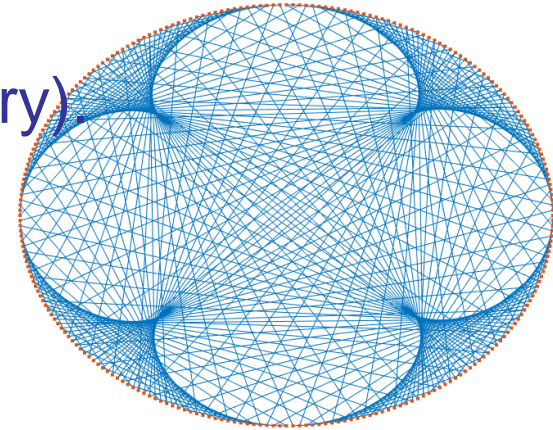
$$\text{for all } a, b, \langle x_a, y_b \rangle = 0.$$

i.e., the two sets of sequences are orthogonal.

Properties of C4 sequences

- Invariant by a $\pi/2$ rotation (4-fold symmetry).
- $x\left(n + \frac{q}{4}\right) = j^{-c}x(n)$, $c=1$ clockwise,
 $c=-1$, anticlockwise.
- $R_x(\tau) = j^{-kc}q$, when $\tau = \frac{kq}{4}$, 0 otherwise
- $D_l\left(k\frac{q}{4}\right) = 2, k = 1,2,3,4$
- From a length q C4 sequence, it is possible to generate a set of q lengths sequence of length $p = q/4$ $\{x_a^p\}$, $a = 0,1, \dots, q$ verifying

$$\|x_a^p - x_b^p\|^2 \geq q/2 \text{ if } a \neq b$$

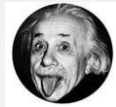




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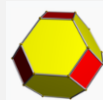
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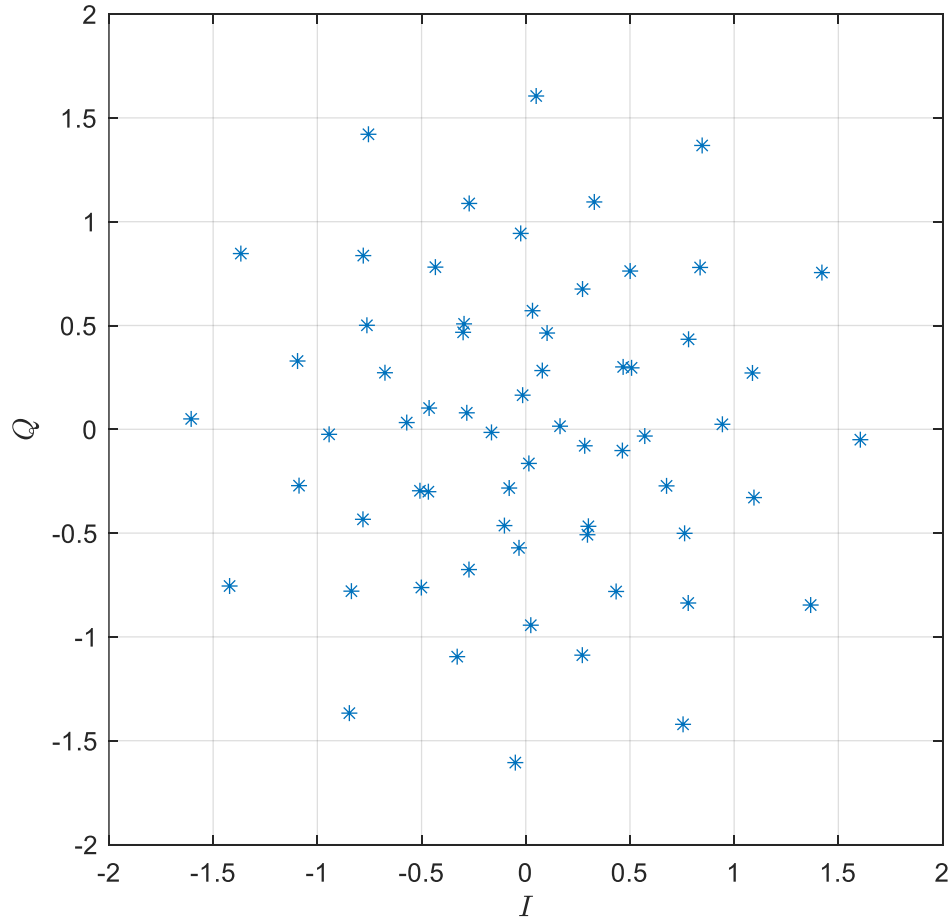


Shaping of C4-Constellations

- String art sequences are particular case of C4-sequences.
- By the selection of vector θ , flexibility to shape the C4-sequence.
 - ◇ \Rightarrow points on unit circle
 - ◇ \Rightarrow points on 2 or more circles
 - ◇ \Rightarrow Optimization for a given criteria
 - ◇ Mutual information (MI) of the constellation alone in AWGN channel.



$q = 64$ C4-constellation, SNR of 10 dB



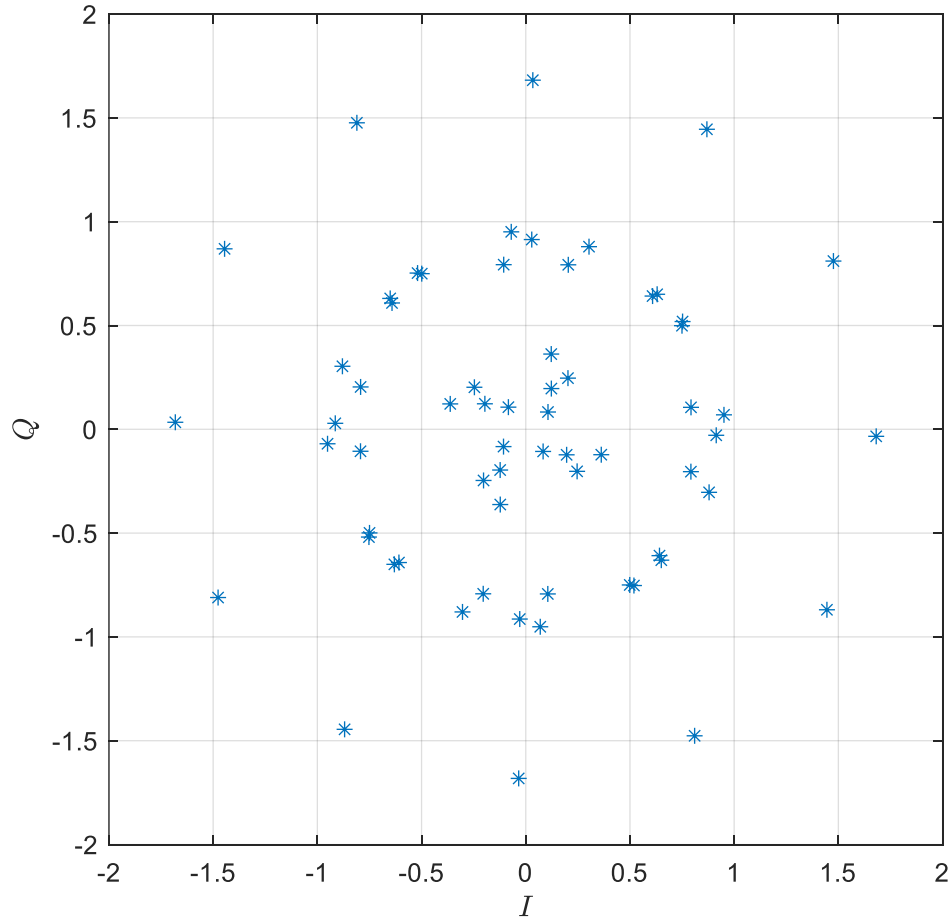
Capacity: 3.4594 bit/s/Hz

MI: 3.4192 bit/s/Hz

98.8379 % of capacity



$q = 64$ C4-constellation, SNR of 5 dB



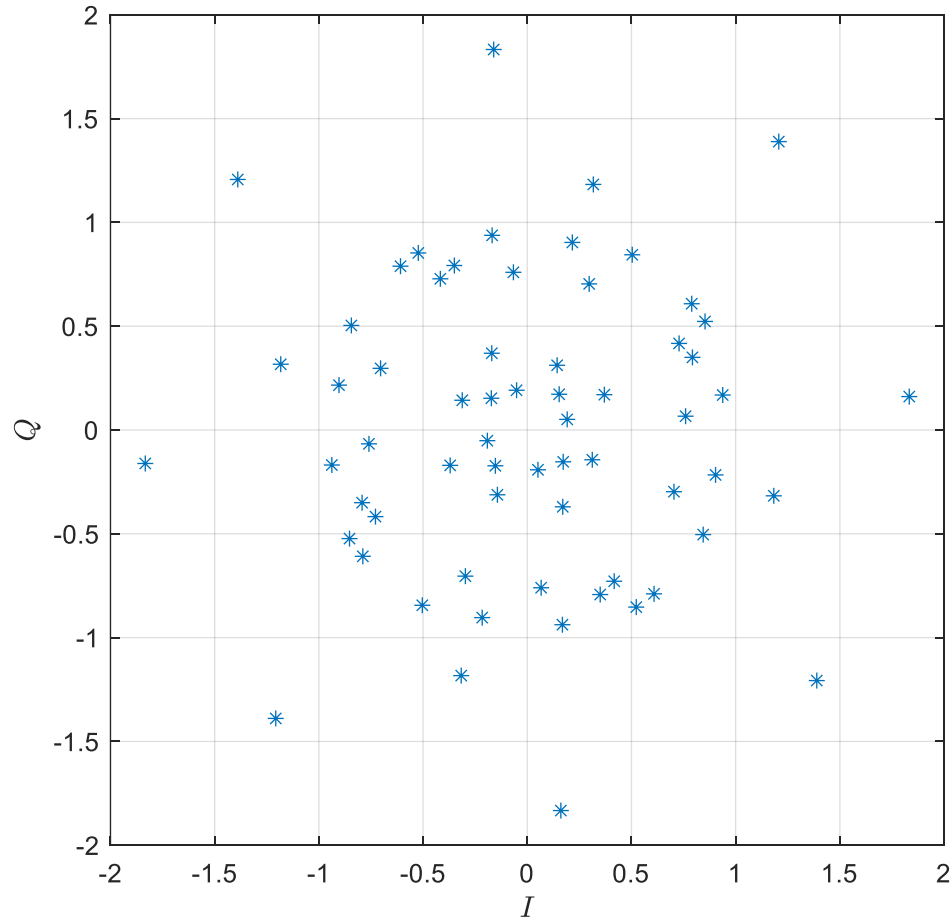
Capacity: 2.0574 bit/s/Hz

MI: 2.0537 bit/s/Hz

99.8227 % of capacity



$q = 64$ C4-constellation, SNR of 0 dB



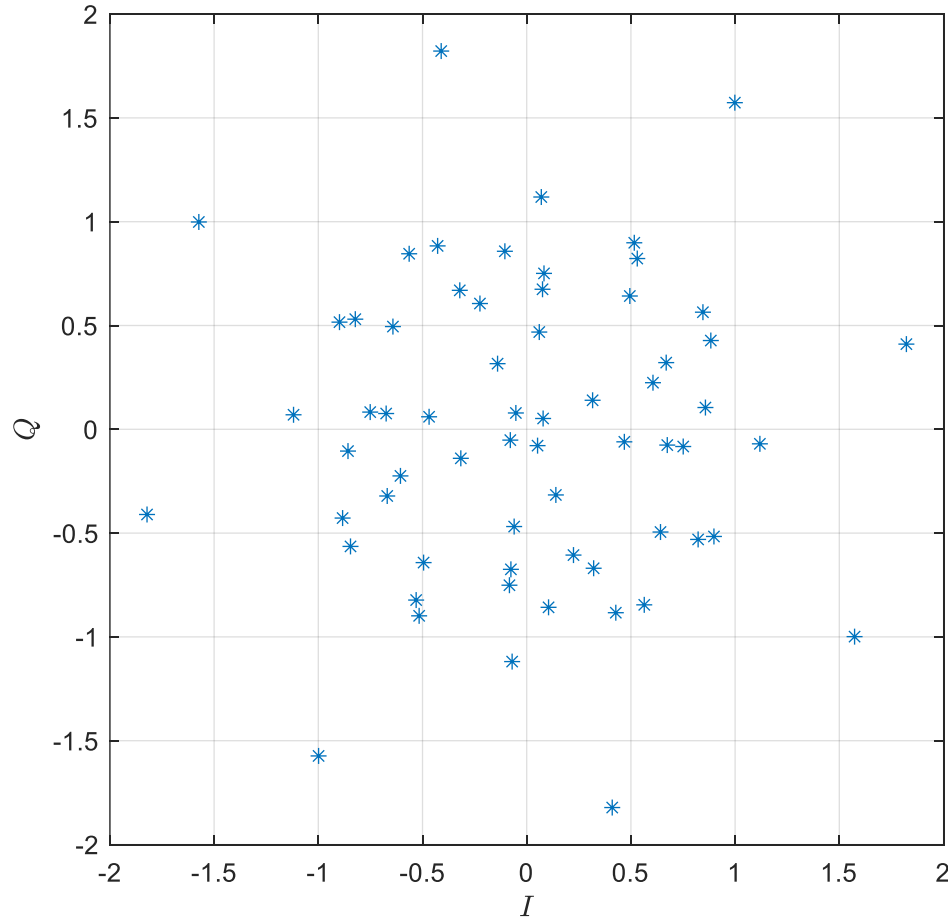
Capacity: 1.0000 bit/s/Hz

MI: 0.9998 bit/s/Hz

99.998 % of capacity



$q=64$ C4-constellation, SNR of -5 dB

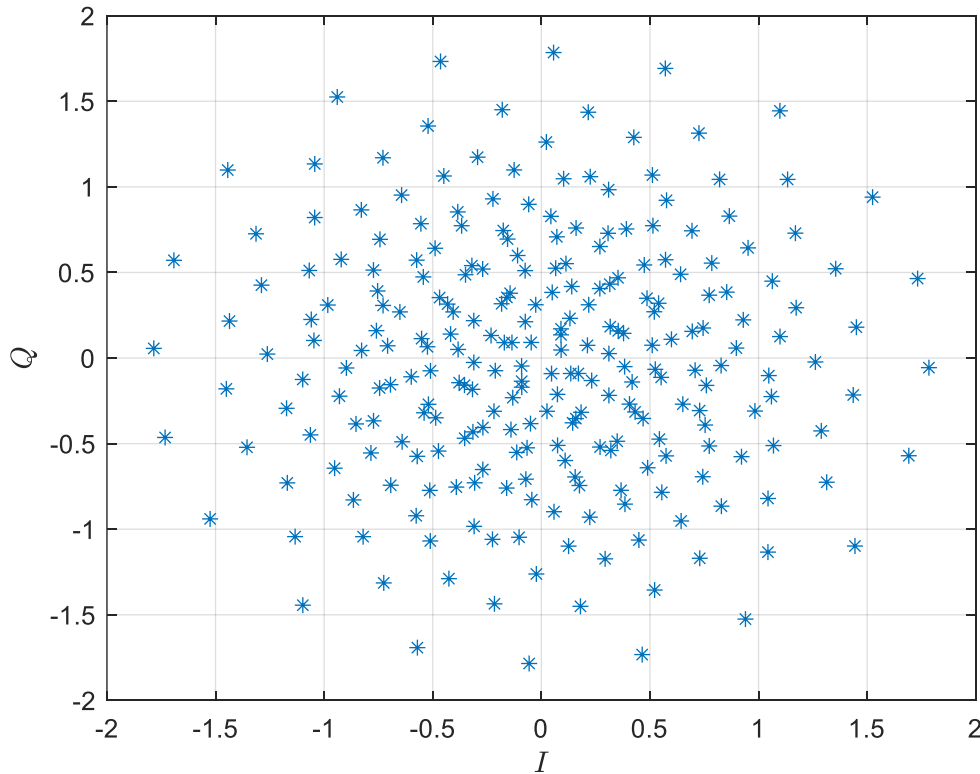


Capacity: 0.396409 bit/s/Hz

MI: 0.396408 bit/s/Hz

99.999891 % of capacity

$q=256$ C4-constellation, SNR of 15 dB



Capacity: 5.0278 bit/s/Hz

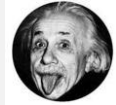
MI: 4.9867 bit/s/Hz

99.18238184 % of capacity

Outline



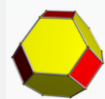
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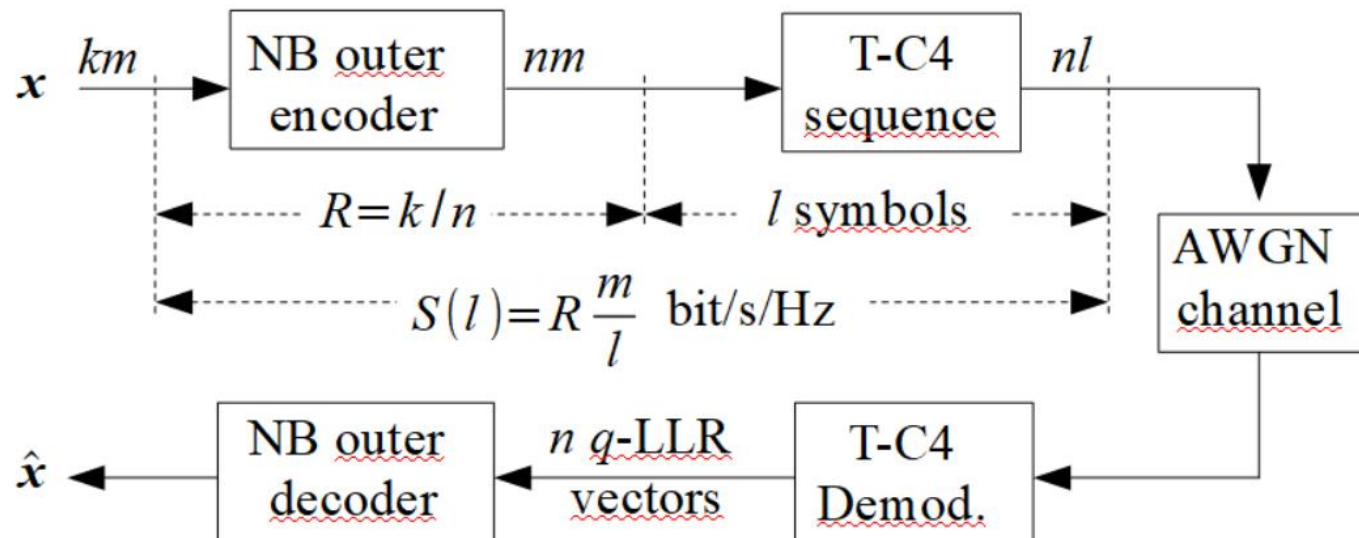


Geometrical shaping



Coded modulation

Proposed coded modulation ($q = 2^m$)



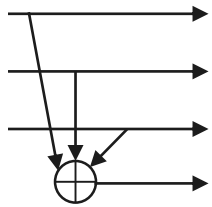
- Global spectral efficiency: $\frac{mR}{l}$ bit/s/Hz.

Degree 4 Parity Check over GF(64)

$q = 64, m = 6$ C4 sequence optimized for 5 dB of SNR

Overall spectral efficiency (bit/s/Hz)

18 bits

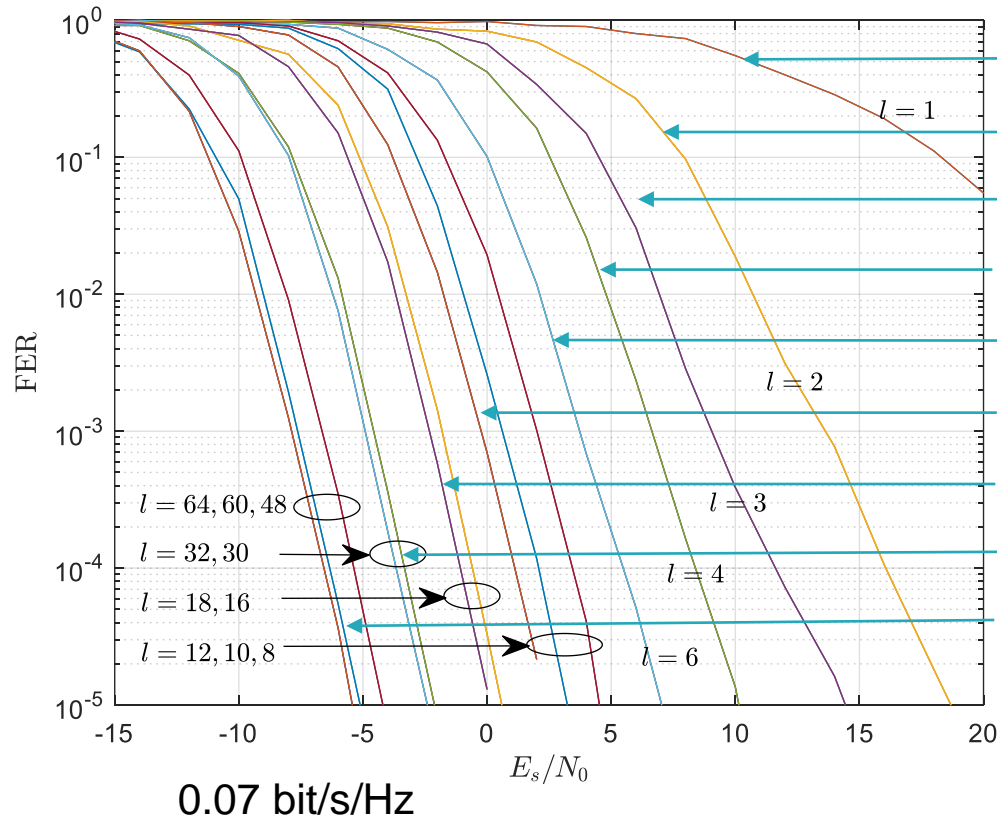


24 bits

Outer NB code: single parity over GF(64), $R = 3/4$

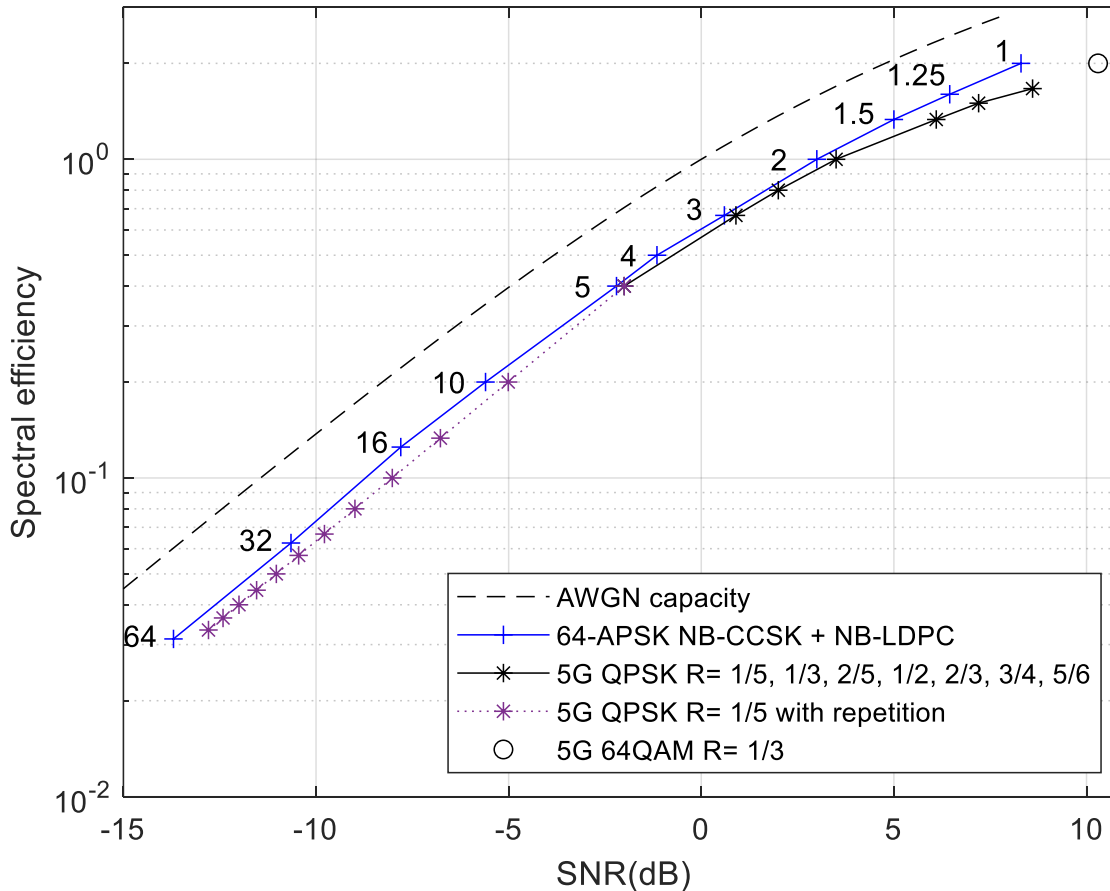
Spectral efficiency:

$$\frac{mR}{l} = \frac{6 \times 3/4}{l} = \frac{9}{2l} \text{ bit/s/Hz.}$$

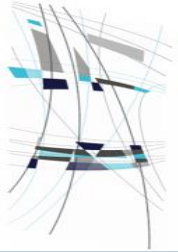




Finite length simulation, $q = 64$, $k = 120$ bits, NB-LDPC $R = 1/3$.



- Finite length simulation confirmed theoretical results.



Potential applications of C4-sequences

- May be used for geometrical shaping
- May be used in multi-users environment to identify users.
- May be used, like ZC sequences, for synchronization.
- May be used for flexible rate adaptive coded modulation.

Potential extensions

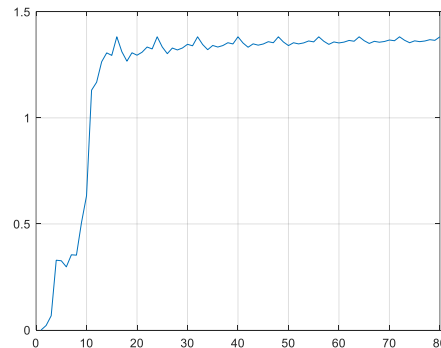
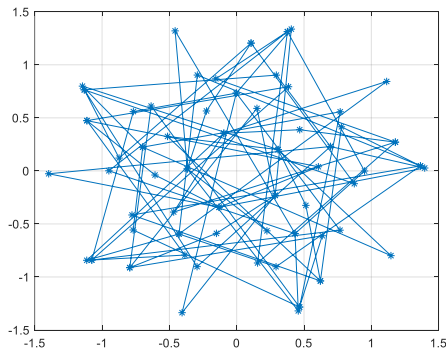
- The 4 in C4 can also be the 4 optimal truncation lengths.
- Extension of C4 sequences to C3 or C5 sequences possible: in the construction process, replace

$$Y = 4 * \sqrt{q/4} * \text{kron}(S, [0 \ 1 \ 0 \ 0]);$$

by

$$Y = 5 * \sqrt{q/5} * \text{kron}(S, [0 \ 1 \ 0 \ 0 \ 0]); \text{ (for example)}$$

to create C5 sequence with a 5-fold symmetry



niv-ubs.fr/ <https://ai4code.projects.labsticc.fr/>

Thank you !

