

Game Theory for Wireless Networks

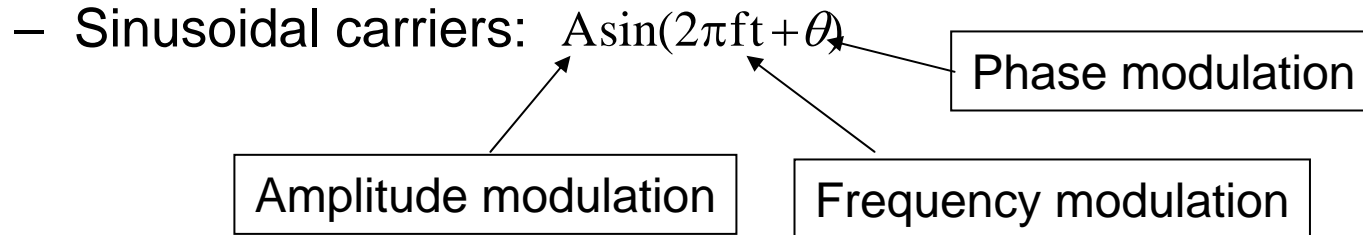
Lecture 9

Course outline

- Adaptive modulation for wireless networks
 - Paper on joint power control and link adaptation
 - Paper on dynamic energy minimization for wireless transceivers
- Your presentations
 - Power control
 - Power control and pricing

Adaptive modulation

- Recall – we transmit symbols over the air by modulating a carrier



- Quadrature modulation: we use as carriers both sin and cos

- M-ary modulation: $A_1, A_2 = \pm 1, \pm 3, \dots, \pm \sqrt{M} - 1$

- Example M - QAM

- $\log_2 M$ bits encoded into one symbol

- Large M – higher rates!!!

- **Higher BER too** → need higher SNR/SIR → better quality channel

Adaptive modulation

- BER target \rightarrow application specific: imposed
- Channel quality fluctuates \rightarrow change modulation to meet target BER
 - Fading
 - Interference changes (burstiness, mobility, access control, etc.)
- Channel quality fluctuates \rightarrow change transmission power to achieve target BER
- Adaptive modulation and power control: related \rightarrow joint optimization??

Joint link adaptation and power control

- Reference: “Game theoretic Analysis of Joint Link Adaptation and Distributed Power Control in GPRS”, S. Ginde, J. Neel, R. M. Buehrer, VTC, fall 2003.
- Application for GPRS
 - General Packet Radio Service → standard for wireless data communications → extension from GSM (Global System for Mobile Communications): digital cellular system, based on TDMA technology

System model – cellular with TDMA technology

Similar as in our SIR analysis:

- First tier of interferers
- cellular reuse factor: 3

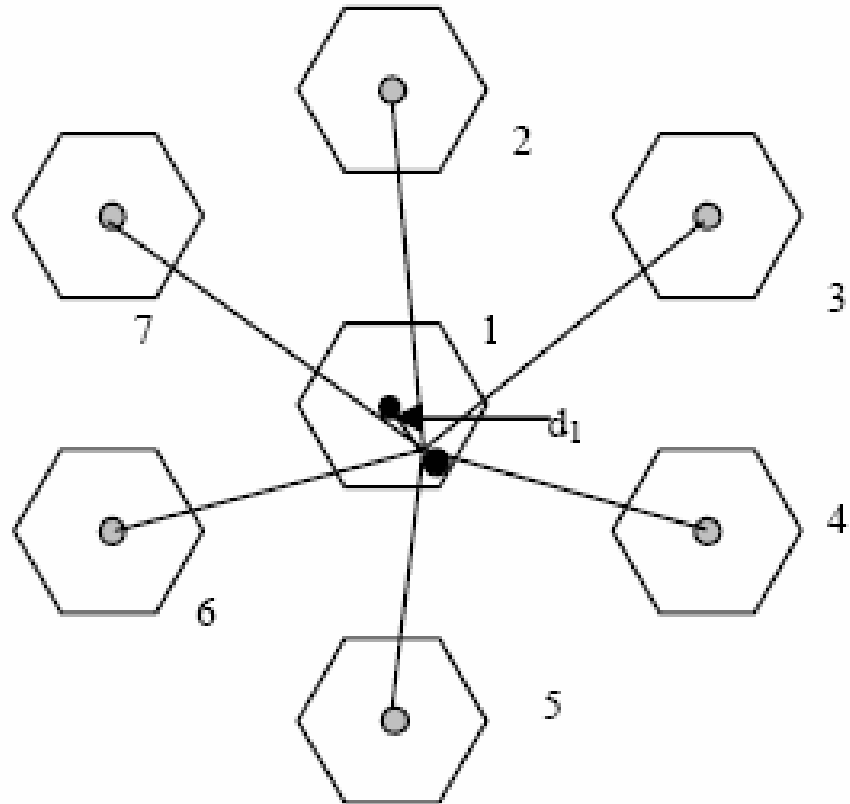
-Compute SIR in dB for user i:

$$\text{SIR} \rightarrow \gamma_i = 10 \log_{10} \left(\frac{G_{ii} P_i}{\sum_{j \neq i}^N G_{ij} P_j + \eta_i} \right)$$

Transmitted Power for user j

link gain (path loss)

noise at receiver i



Performance measure

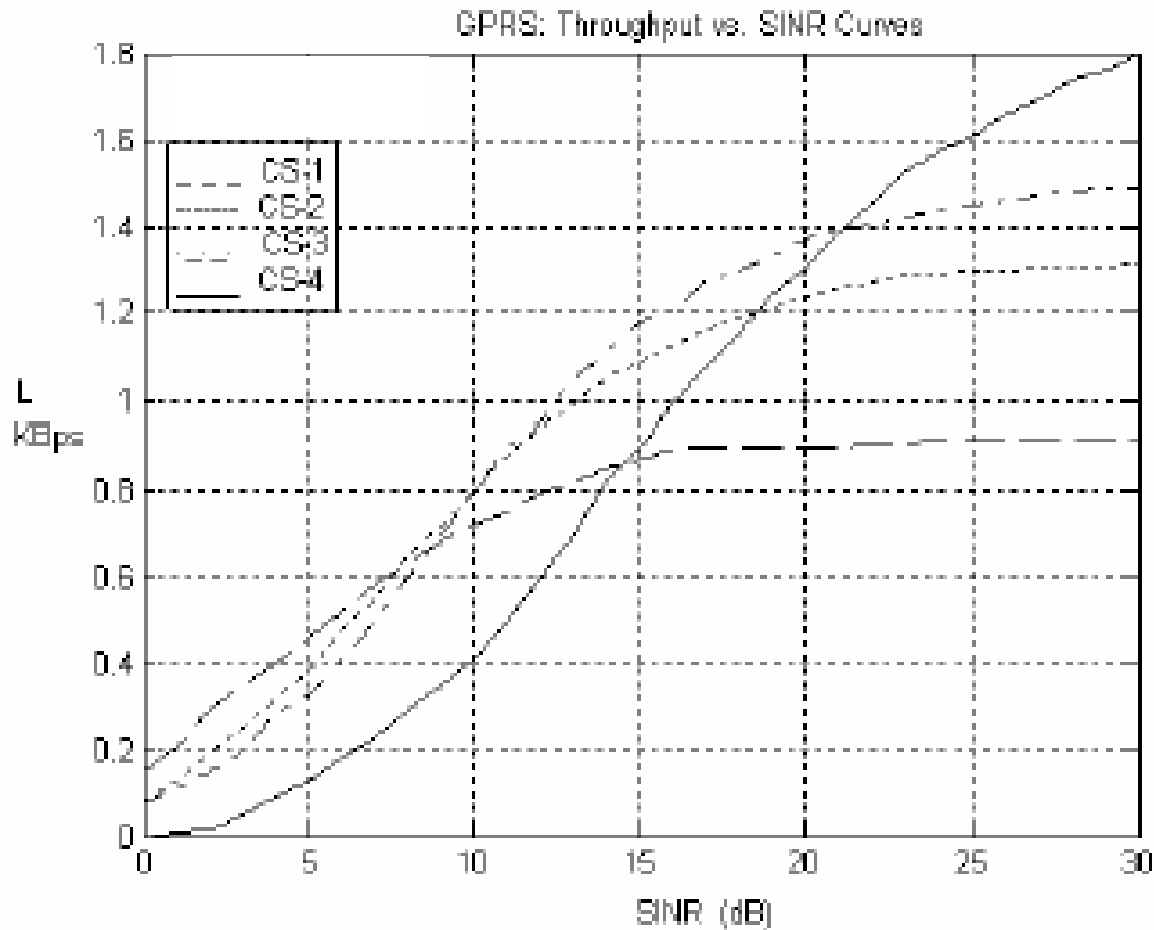
- Performance measure: **analytical model for throughput**
 - Depends on the SNR(SIR)
 - Can be modeled by a sigmoid function of the SIR, with some parameters: A , λ , and $\delta \rightarrow$ fitted for given modulation and coding

$$L(\gamma) = \frac{A}{1 + \exp[-\lambda(\gamma - \delta)]}$$

TABLE I. GPRS CODING SCHEMES [3]

Coding Scheme	Modulation	Code Rate	Data rate/ Time slot
CS-I	GMSK	0.49	9.05 kbps
CS-II	GMSK	0.64	13.4 kbps
CS-III	GMSK	0.73	15.6 kbps
CS-IV	GMSK	1	21.4kbps

Performance measure: Throughput



CS	A kbps	λ	δ dB
CS-1	7.36	0.272	4.75
CS-2	10.52	0.256	8.250
CS-3	11.88	0.256	9.5
CS-4	14.36	0.231	15

Game theoretic formulation

- Players: set of co-channel links
- Actions: select powers and rates:

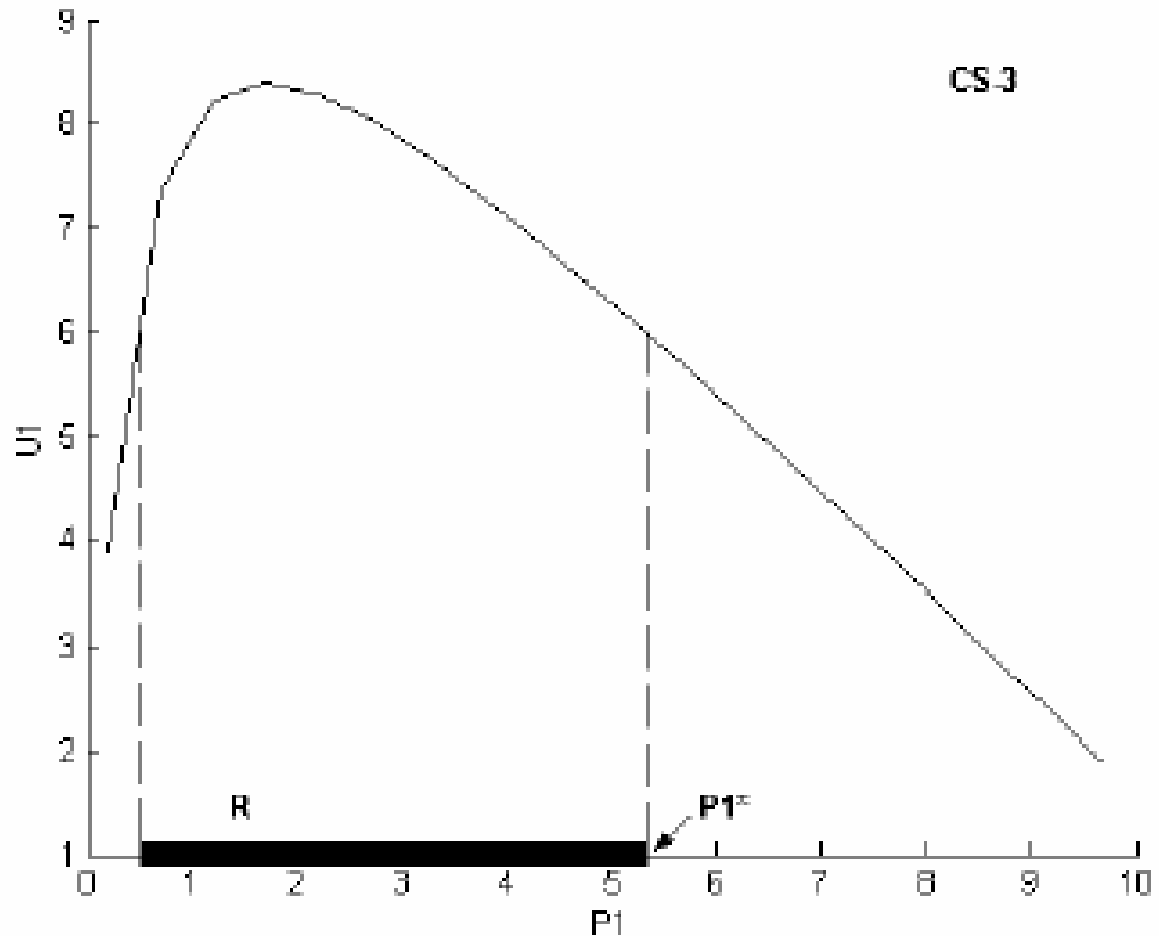
$$A_i = \{(P_i, r_i) \mid P_i \in [P_{i,\min}, P_{i,\max}], r_i \in \{r_1, r_2, r_3, r_4\}\}$$

- Utility function: throughput measure with pricing function

$$U_i(\mathbf{P}, r_i) = \frac{A(r_i)}{1 + \exp\{-\lambda(r_i)[\gamma_i - \delta(r_i)]\}} - KP_i^q$$

Existence of Nash equilibrium

- If keep rates constant (select only powers) \rightarrow Debreu's theorem holds \rightarrow guaranteed to have at least 1 Nash equilibrium



Joint power control and rate assignment solution

- Two step optimization:
 - start with some initial values for powers and rates
 - Step1: select power to maximize utility function

$$P_{i,eqm} = \max_{P_i} U_i(P_i, P_{-i}, r_i)$$

- Step 2: for the given selected powers, determine rates

$$r_{i,eqm} = \arg \max_{r_i} U_i(r_i, \mathbf{P}_{eqm})$$

- Continue until no improvement in rates can be achieved

Figures of merit definition

- **FOM1:** ratio between system throughput and sum of the fractions of peak power consumed by links

$$FOM1 = \frac{\sum_i L_i}{\sum_i \frac{P_i}{P_{\max}}}$$

- **FOM2:** difference between system throughput and sum of the fractions of peak power consumed by links, scaled by the peak throughput

$$FOM2 = \sum_i L_i - A_{\max} \sum_i \frac{P_i}{P_{\max}}$$

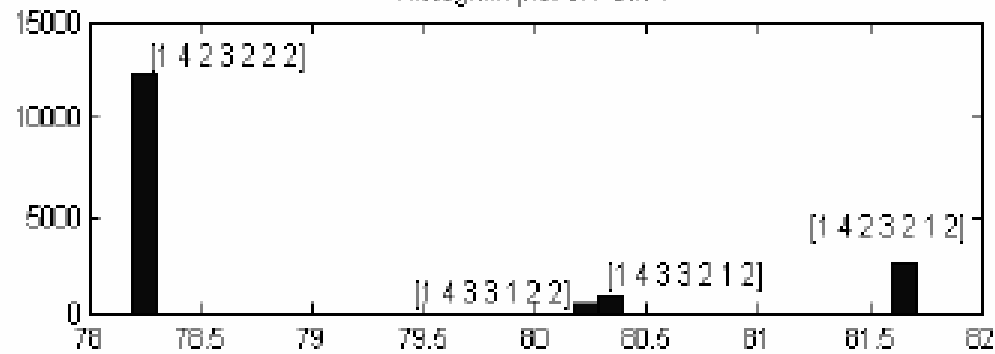
- **FOM3:** system throughput

$$FOM3 = \sum_i L_i$$

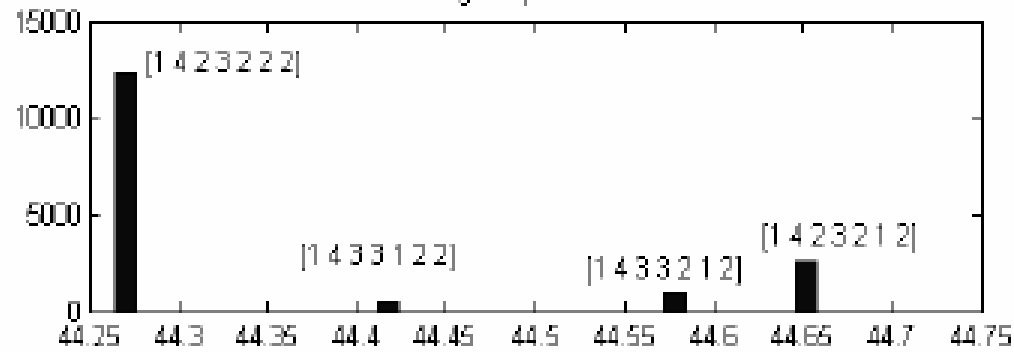
Nash equilibrium: not unique

$K=1, q=2, \text{SNR}=100\text{dB}$

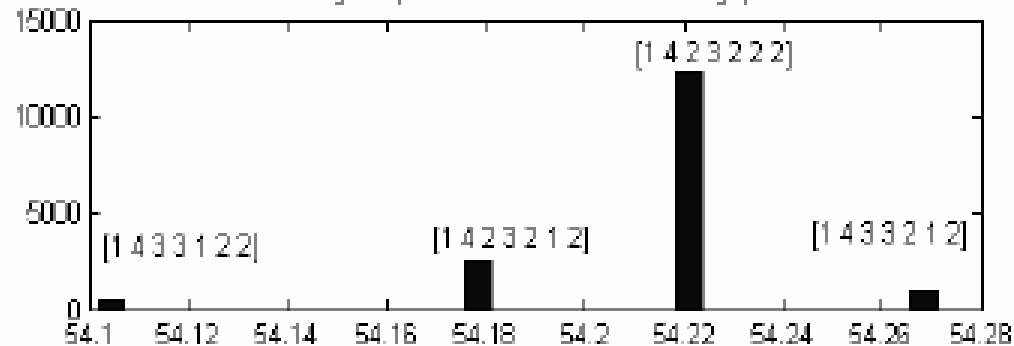
Histogram plot of FOM 1



Histogram plot of FOM 2



Histogram plot of FOM 3 = Sum of throughputs



Some performance results

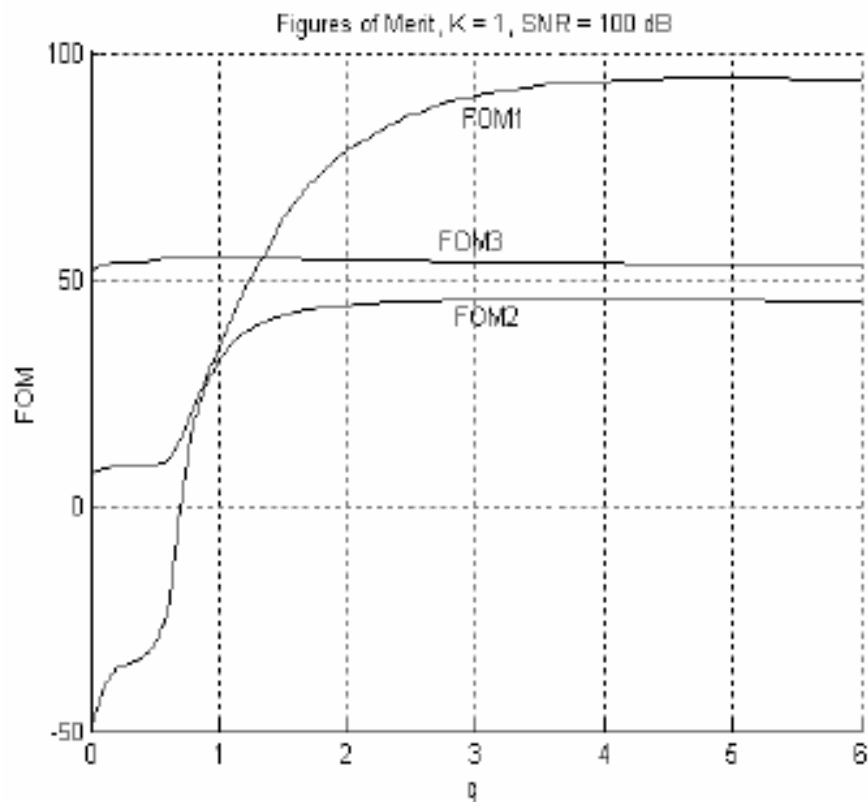


Figure 5. Effect of q on FOM's, SNR = 100 dB

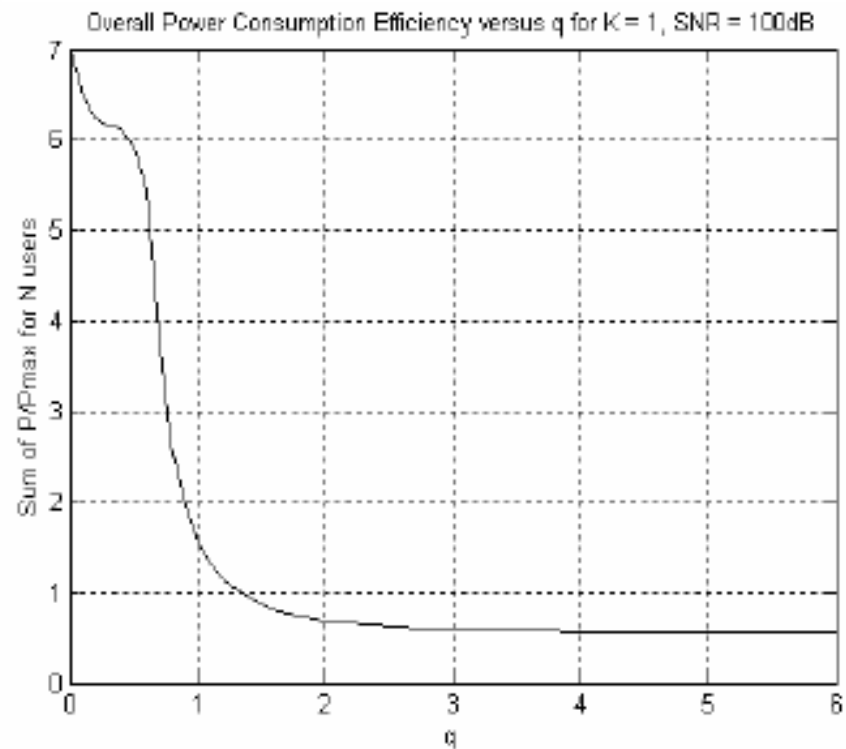


Figure 6. Effect on q on power consumption

More performance results

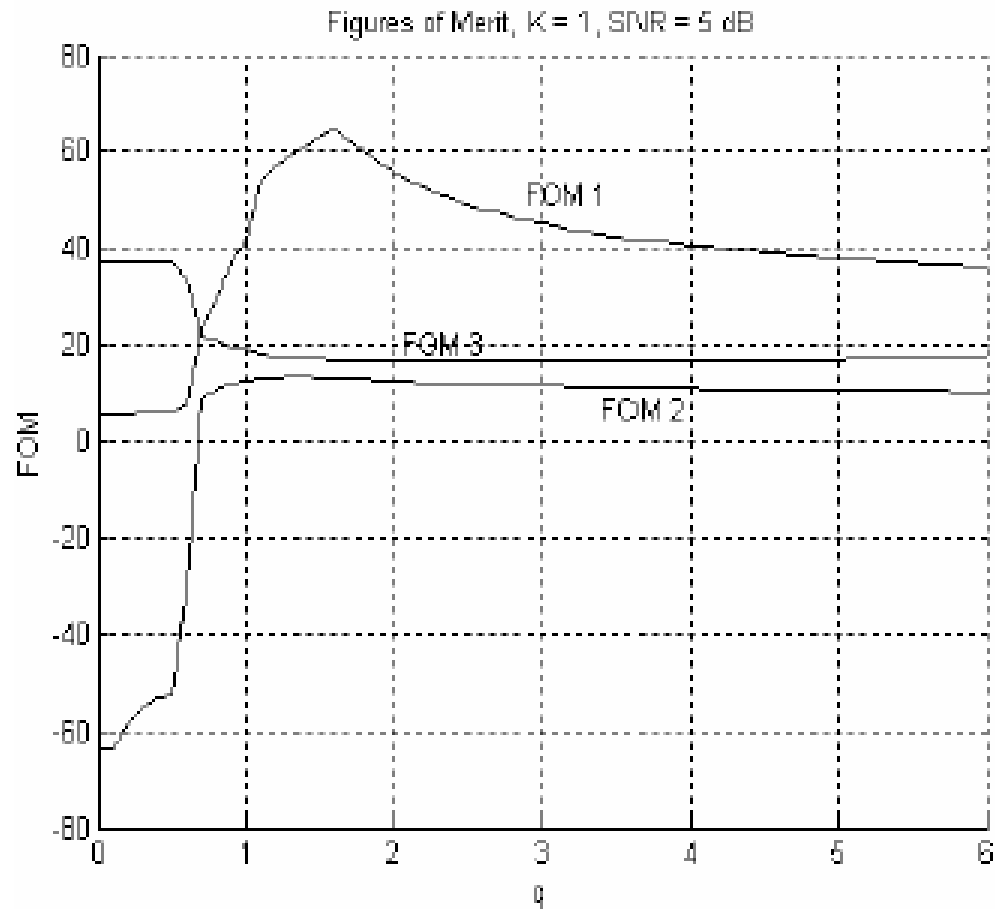


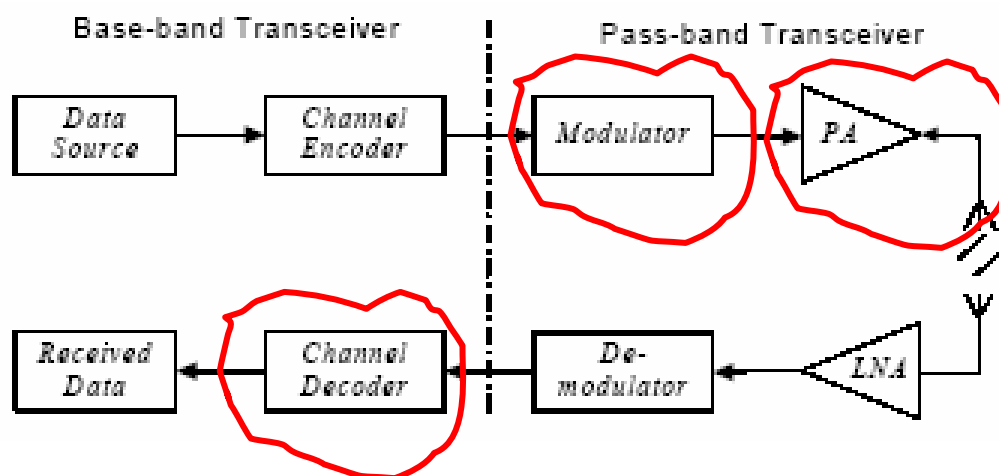
Figure 7. Effect of q on FOM's, SNR = 5 dB

Dynamic energy minimization in wireless transceivers

- Reference: “A Game Theoretic Approach to Dynamic Energy Minimization in Wireless Transceivers”, A. Iranli, H. Fatemi, M. Pedram, Int’l Conference on Computer Aided Design, November 2003, pp. 504-509.
- System model: ad hoc network, OFDM (Orthogonal Frequency Division Multiplexing) transmission (802.11a)
 - OFDM = multicarrier transmission technique, which allows a more tight packing of multiple carrier frequencies, by keeping the carriers orthogonal
 - A signal is split into sub-signals that are transmitted in parallel on the multiple carriers

Optimization problem

- Minimize total energy consumption for a link
 - (A) Minimize energy at transmitter
 - (B) Minimize energy at receiver



Optimization problem

- No interference is considered
- Transmitter: can select powers and modulation levels → influences the total energy expenditure
- Receiver: can choose decoder's parameters:
 - For convolutional codes → Adaptive Viterbi decoder → accuracy of decoder increases as the number of decoding stages increases; however, the power consumption of the decoder increases also
 - Parameters chosen: Truncation length (number of paths consider to find the optimum path) of the decoder
- Receiver and transmitter alone cannot optimize energy independently, depend one of another
- Optimization modeled as a Stackelberg game → multi-level optimization problem formulated

Optimization problem

- Strategy for the receiver: $x \in X$

$$X = \{(TL_1, TL_2, \dots, TL_n \mid \forall i : TL_i \in TLS)\}$$

- Strategy for transmitter: $y \in Y$

$$Y = \{P_{Tx}, b_1, b_2, \dots, b_n \mid i : b_i \in MLS, P_{Tx} \in PLS\}$$

- Optimization:

$$\{(\hat{X}, \hat{Y}) \mid A\hat{X} + B\hat{Y} < R\hat{E}Q_{Tx}, D\hat{Y} \geq R\hat{E}Q_{Tx}, \hat{X}, \hat{Y} \geq 0\}$$

Coef. Matrices – account for channel characteristics

Vector \rightarrow upper bound on overall Energy consumption

Coef. Matrix for linear est. of throughput and BER, in terms of SNR and mod. level

Some performance results

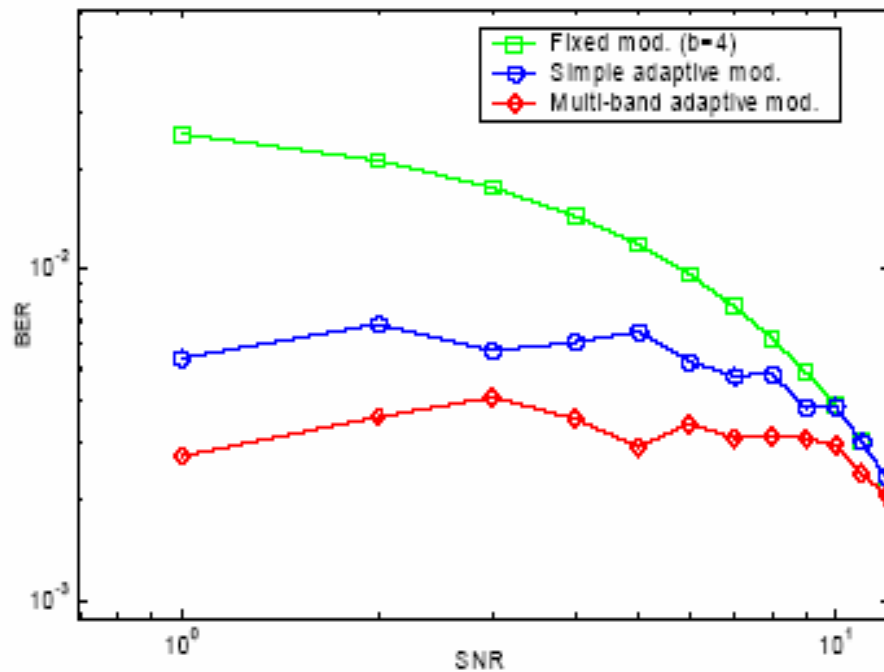
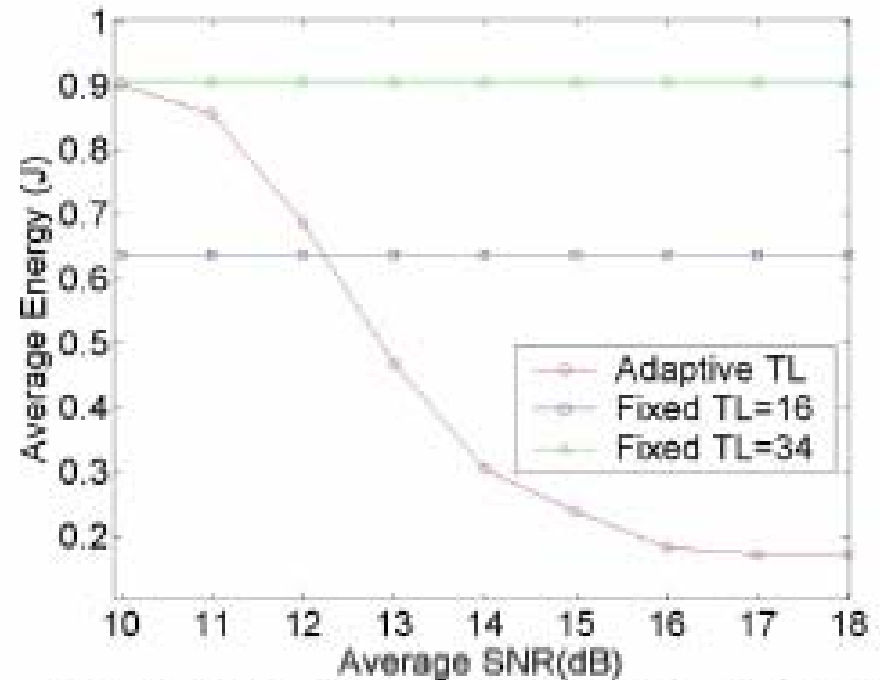


Figure 5. Average BER as a function of SNR for adaptive and fixed modulations



(a) Average Energy vs. SNR ($BER=10^{-4}$ & $b=4$)

More performance results

$$E_{avg} = \alpha \cdot E_{Transmit} + (1 - \alpha) \cdot E_{Receive}$$

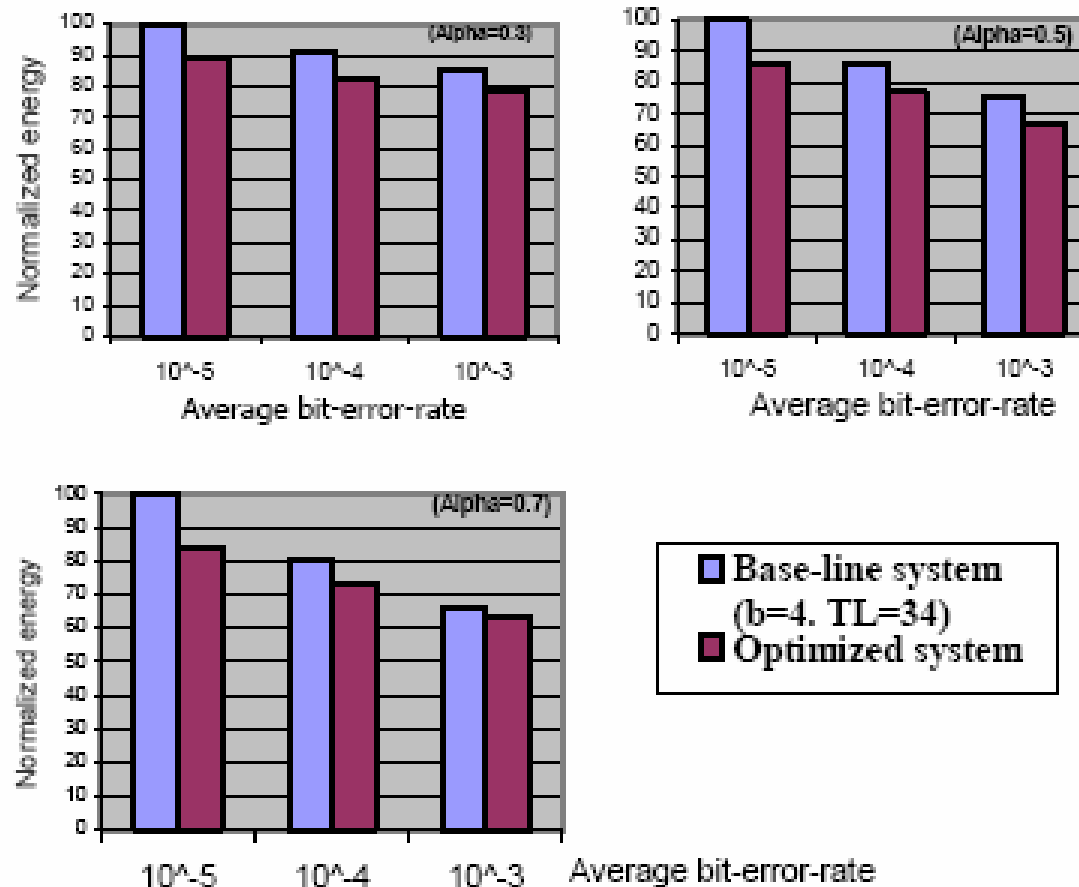


Figure 7. Normalized energy consumptions