

# Total optimisation of a media-streaming wireless terminal: Energy-efficient link adaptation under higher-layer criteria<sup>1</sup>

Virgilio RODRIGUEZ

Institute for Communication Networks (ComNets)  
RWTH Aachen  
Aachen, Germany  
email: rodriguez@comnets.rwth-aachen.de

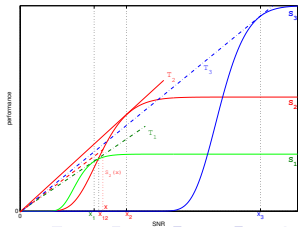
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# Executive Overview

- **Link-layer** parameters (modulation, packet size, coding, etc) should be (adaptively) **optimised**
  - Typical approach: choose modulation to **maximise spectral efficiency** (bps/Hertz) with bit error rate (**BER**) **constraint**
  - For packet communication, **higher-layer criteria** are better (e. g., “**goodput**” for data)
  - Previously, (ISWCS’10) we found the **link-layer configuration** for maximal “**goodput**”
  - We now extend analysis to video streaming
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- **the key**: a **tangent line** from (0,0) to the scaled **packet-success rate** function (PSRF) graph (PSR = 1 minus PER)
  - the **steeper** the **tangent** (greater slope) the **better** the configuration
  - true whenever **PSRF** is an “**S-curve**”



# Ideal point-to-point packetised communication system

- TX makes  $L$ -bit packets including  $C$  error-detection bits ( $L - C$  information bits)
- Each packet transmitted symbol by symbol (e.g., M-QAM)
- $W$ -bandwidth flat-fading channel adds white noise
- Received packet goes through ideal error detector (CRC)
- RX sends positive or negative acknowledgement (ACK/NACK) over idealised feedback channel
- TX re-sends packet until it gets the corresponding ACK

# Link configuration criteria

- Link-layer configuration: (adaptively) choose **modulation**, **bits per symbol**, **packet** length, **code** length, **power**
- Possible optimisation criteria:
  - **Spectral efficiency** : maximise **bits/second/Hertz** with bit error rate constraint  
(Webb, 1995 [1]); (Chung & Goldsmith, 2001 [2])
  - “**Goodput**” : maximise total **information bits** transferred over a **period of interest**, e.g., bits per second, or bits per Joule (Goldsmith, Goodman, et al., 2006 [3]); present work
  - network utility maximisation (NUM): maximise an index of network performance (e.g., **sum of each link performance**) with average power constraint (O'Neill & Goldsmith, 2008 [4])

# Goodput-optimal link configuration

- (Goldsmith, Goodman, et al., 2006 [3]) proposes it for
  - single communication link
  - M-QAM modulation
  - error-detecting codes (CRC)
- performance index: (net) throughput (goodput), given by

$$T = \frac{L - C}{L} b R_s f(b, \gamma_s, L) \quad (1)$$

- $L, C$  : packet length, CRC length in bits
- $b, R_s$  bits per symbol, symbol rate
- $\gamma_s$  : *per symbol* signal-to-noise ratio.
- $f(b, \gamma_s, L) = [1 - P_b(\gamma_s, b)]^{L/b}$  packet-success rate ( 1 - PER)
- $P_b(\gamma_s, b)$  *symbol*-error probability
- Basic idea: choose parameters that maximise  $T$

## Issues with goodput-optimal link configuration

- [3]'s **algebraic approach** requires PSRF in explicit formula
- Such formulae valid only under strong assumptions, and/or major simplifications, and for very specific systems
- Expressions **barely tractable**. Approximation for M-QAM:

$$T = \frac{L-C}{L} b R_s \left[ 1 - 4(1 - 2^{-b/2}) Q \left( \sqrt{\frac{\rho}{N_0 R_s} \left( \frac{3}{2^b - 1} \right)} \right) \right]^{L/b}$$

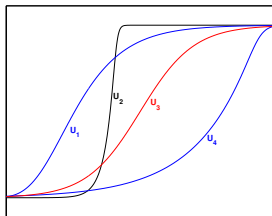
with  $Q(x) = \int_x^\infty \exp(-\frac{1}{2}t^2) dt \Leftarrow$  **NO** explicit **solution!**

- Certain technical steps seem controversial:
  - all parameters are treated as **continuous** (even **bits/symbol**)
  - **derivatives** are taken with respect to them
- Solutions are hard to interpret; general lessons elusive

# Generalised packet-success rate function

We **drop algebra** in favour of **analytical geometry**:

- for link parameters,  $\mathbf{a}$ , & symbol-SNR  $x$ ,  $F(x; \mathbf{a})$  : packet-success rate. Ex:  
 $F(x; \mathbf{a}) = [1 - P_b(x, b)]^{L/b}$ ,  $\mathbf{a} = (L, b)$
- For technical reasons,  
 $f(x; \mathbf{a}) := F(x; \mathbf{a}) - F(0; \mathbf{a})$  replaces  $F$
- Assume the graph of  $f(x; \mathbf{a})$  **has** the **S-shape** shown
- S-curves are very **general** ( “almost” **concave**, **convex**, **linear**, “ramps” etc)



## Link configuration criteria for data terminals

- Criteria for data terminal: maximise **total** number of **information bits** transferred **over period of interest**,  $\tau$ 
  - with **unlimited energy**, set  $\tau$  as time unit  
⇒ info bits/second (“**goodput**”) **maximisation**
  - with **energy budget**  $E$ ,  $\tau$  is “battery life” ( $E/p$  if power= $p$ )  
⇒ info **bits/Joule maximisation**
- Transferred info bits in  $\tau$  secs, with PSR  $f(\gamma_s; \mathbf{a})$  :

$$\tau \frac{L-C}{L} b R_s f(\gamma_s; \mathbf{a}) \quad (2)$$



# Maximising transferred information bits per Joule

## Fact

The max no. of transferred info bits with configuration  $\mathbf{a}$ , energy  $E$ , & normalised ch gain  $h$  is  $(hE)S(x^*; \mathbf{a})/x^*$  where  $S$ -curve  $S(x; \mathbf{a}) := ((L - C)/L)bf(x; \mathbf{a})$ , &  $x^*$  maximises  $S(x; \mathbf{a})/x$

- with power  $p$ , SNR  $x = hp/R_s$ , & energy lasts  $\tau = E/p$
- By (2), the number of transferred info bits in  $\tau$  secs is

$$\frac{E}{p} \frac{L - C}{L} b R_s f(hp/R_s; \mathbf{a}) \equiv hE \frac{L - C}{L} b \frac{f(hp/R_s; \mathbf{a})}{hp/R_s} \equiv hE \frac{S(x; \mathbf{a})}{x} \quad (3)$$

- $hE$  is fixed;  $\therefore$  the SNR that maximises  $S(x; \mathbf{a})/x$  is optimal.
- For a given configuration,  $b(L - C)/L$  is a constant. Thus,  $S(x; \mathbf{a}) \propto f(x; \mathbf{a})$ , & if  $f$  is an S-curve, so is  $S$ .

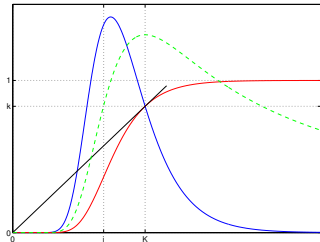
# The maximiser of $S(x)/x$

## Fact

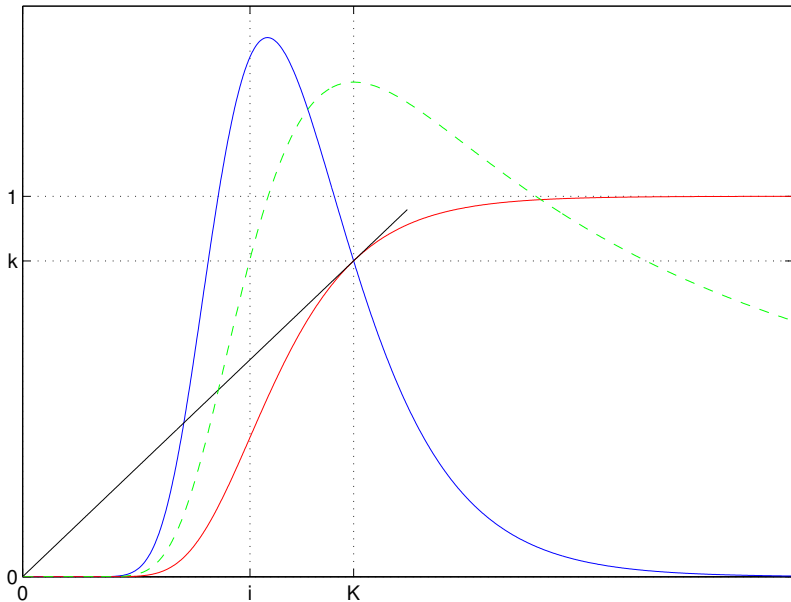
*If  $S$  is an S-curve, then, (i)  $S(x)/x$  has a unique maximum, (ii) found at the tangency point (“genu”) of the “tangenu” (unique tangent line from  $(0,0)$  to the graph of  $S$ )*

## Proof.

See [5] □



# Maximising $S(x)/x$

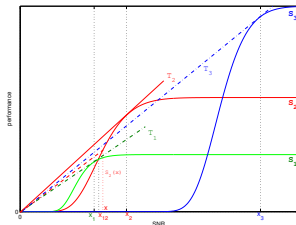


# Most energy-efficient link configuration

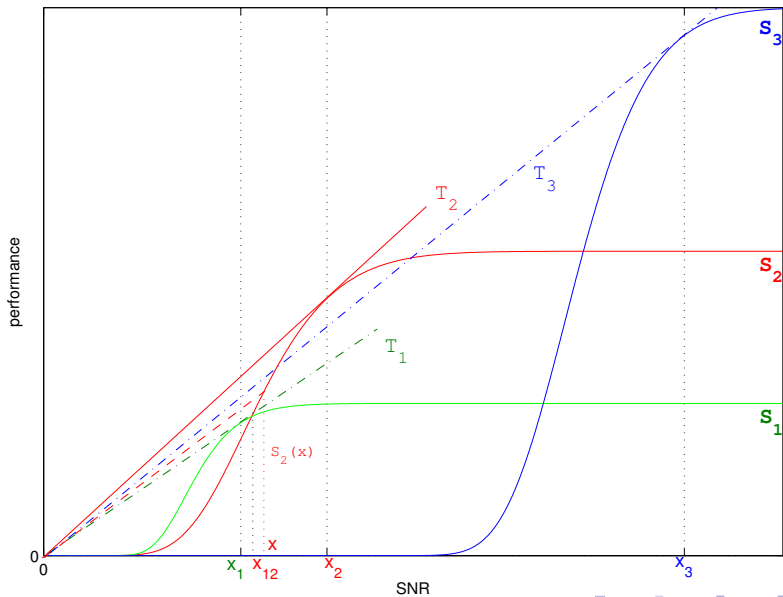
## Theorem

For each configuration  $\mathbf{a}_i$ , let  $S(x; \mathbf{a}_i) = ((L - C)/L)bf(x; \mathbf{a}_i)$ . If  $\mathbf{a}_{j^*}$  maximises transferred info bits per Joule, then  $S(\cdot; \mathbf{a}_{j^*})$  has the steepest tangenu among considered configurations

- Facts : (i) terminal maximises  $EhS(x; \mathbf{a}_i)/x$ , and (ii) maximum occurs at genu (tangency point)  $x_i^*$
- $\therefore$  the maximal number of info bits that can be transferred with configuration  $i$  is  $EhS(x_i^*; \mathbf{a}_i)/x_i^*$ .
- $\therefore$  configuration with greatest ratio  $S(x_i^*; \mathbf{a}_i)/x_i^*$  (steepest tangenu) is best

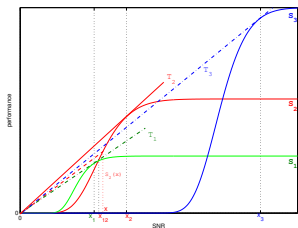


# The steeper the tangent the better the configuration



# Recapitulation

- Previous work recognises the importance of link configuration (modulation, packet size, coding, etc) under higher-layer criteria for packetised communication
  - But it necessitates explicit formulae and controversial technical steps, which limits its applicability
  - Present work is grounded on analytical geometry; it postulates that the PSRF is an S-curve, and from this, it yields a sharp and general result:
- 
- The **steeper** the **tangent** from (0,0) to the (scaled) PSRF graph (an S-curve) the **better** the configuration
  - S-curves include most (if not all) PSRF of interest.  $\therefore$  result is highly applicable
  - Battery-fed terminal discussed; similar result for unlimited energy is in paper



## Limitations/Outlook

- Results obtained “off line” can be put in device’s memory, for link re-configuration through simple table look-ups
- Developing such tables is possible research path
- “Best effort” (data) traffic assumed. Video terminal analysis yielded similar results ( $\Rightarrow$  CISS’11, Johns Hopkins U.)
- Multi-channel scenario (“waterfilling”):  $\Rightarrow$  VTC’11 (Budapest)
- Multi-terminal analysis (interference as noise) under review
- Point-to-point transmission studied. Of interest: to embed analysis in network model, such as [4]’s.

## Video-terminal extension

- Besides link parameters, terminal optimises “encoding rate”: the number  $y$  of info bits available at receiver to reconstruct 1 second of media.
- encoding rate often assumed fixed (e.g., a maximal acceptable distortion); but:
  - video programmes are often offered for Internet streaming in a wide range of “rates”, starting at fairly low values.
  - Well-performing “scalable” video coders are available
- The terminal’s performance given by increasing function  $u(v, q)$ :
  - $v$  : the total number of received media “segments”
  - $q$  : “perceptual quality” of each segment,  $q$ .
  - $q = q(y)$  continuous and increasing



## Video Terminal results

- A “segment” of video lasts one second
- with energy budget  $E$  and power  $P$ ,  $v = E/P$  segments transferred
- $y(hP)$  information bits per second at the receiver yield quality  $q(y)$
- Terminal maximises:  $u(E/P, q(y))$
- Can show this yields

$$\max_{x \geq 0, 0 \leq y \leq \hat{Y}(x; \mathbf{a})} u \left( \frac{Eh}{y} \frac{S(x; \mathbf{a})}{x}, q(y) \right) \quad (4)$$

with  $S(x; \mathbf{a}) = ((L - C)/L)bf(x; \mathbf{a})$ ;  $\hat{Y}(x; \mathbf{a}) = h\hat{P}S(x; \mathbf{a})/x$

- Can prove  $x^*$  (“knee”) is optimal; curve with steepest tangent is best
- $y^*$  maximises  $q(y)/y$  (quality per unit resource)

# Maximising goodput (unlimited energy supply)

## Fact

The max goodput with configuration  $\mathbf{a}$ , power limit  $\hat{p}$  & normalised ch-gain  $h$  is  $h\hat{p}S(x^*; \mathbf{a})/x^*$  where S-curve  $S(x; \mathbf{a}) := ((L - C)/L)bf(x; \mathbf{a})$ , &  $x^*$  maximises  $S(x; \mathbf{a})/x$

- infinite energy  $\implies$  optimal  $p = \hat{p}$
- SNR  $x = h\hat{p}/R_s \implies R_s = h\hat{p}/x$
- By (2), the number of transferred info bits over 1 sec is

$$\frac{L - C}{L} b R_s f(h\hat{p}/R_s; \mathbf{a}) \equiv h\hat{p} \frac{L - C}{L} b \frac{f(x; \mathbf{a})}{x} \equiv h\hat{p} \frac{S(x; \mathbf{a})}{x} \quad (5)$$

- $h\hat{p}$  is fixed;  $\therefore$  the SNR that maximises  $S(x; \mathbf{a})/x$  is optimal
- For a given configuration,  $b(L - C)/L$  is a constant. Thus,  $S(x; \mathbf{a}) \propto f(x; \mathbf{a})$ , & if  $f$  is an S-curve, so is  $S$
- $\therefore$  **main theorem** also **applies** under unlimited energy

## link configuration goodput trade-offs

- Goldsmith/Goodman[3] 's performance index




$$T = \frac{L-C}{L} b R_s [1 - P_b(\gamma_s, b)]^{L/b}$$

$$\text{for M-QAM, } P_b \approx 4(1 - 2^{-b/2})Q\left(\sqrt{\frac{hp}{R_s} \left(\frac{3}{2^b - 1}\right)}\right)$$



$\gamma_s = hp/R_s$ : symbol SNR;  $p$ : power;  $h$ : ch gain over noise

- Assume  $C$  held constant (e.g.  $C = 16$  bits)
- Some trade-offs:
  - $L$  increases  $(L-C)/L$  but reduces PSR= $[1 - P_b(\gamma_s, b)]^{L/b}$
  - $b$  raises “raw” bps,  $bR_s$ , but lowers energy/bit (& PSR)
  - $R_s$  increases raw bps but reduces  $\gamma_s$  & hence PSR
  - power raises SNR(& PSR) but lowers “battery life”, if appl.

## For Further Reading I

-  W. Webb and R. Steele, “Variable rate QAM for mobile radio,” *Communications, IEEE Transactions on*, vol. 43, pp. 2223–2230, Jul 1995.
-  S. T. Chung and A. Goldsmith, “Degrees of freedom in adaptive modulation: a unified view,” *Communications, IEEE Transactions on*, vol. 49, pp. 1561–1571, Sep 2001.
-  T. Yoo, R. J. Lavery, A. Goldsmith, and D. J. Goodman, “Throughput optimization using adaptive techniques.”  
<http://wsl.stanford.edu/>, 2006.

## For Further Reading II

-  D. O'Neill, A. Goldsmith, and S. Boyd, "Optimizing adaptive modulation in wireless networks via utility maximization," in *Communications. IEEE International Conference on*, pp. 3372–3377, May 2008.
-  V. Rodriguez, "An analytical foundation for resource management in wireless communication," in *Global Telecommunications Conf.(GLOBECOM), IEEE*, vol. 2, pp. 898–902 Vol.2, Dec. 2003.