

How I Learned to Stop Worrying and Love Outage Capacity

 ${\rm TOBIAS} \ {\rm KOCH} \\ {\rm Universidad} \ {\rm Carlos} \ {\rm III} \ {\rm de} \ {\rm Madrid}, \ {\rm Spain} \\$

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Joint work with Wei Yang, Giuseppe Durisi, and Yury Polyanskiy

 $\mathbf{Y}_k = \mathbb{H}\mathbf{x}_k + \mathbf{W}_k, \quad k \in \mathbb{Z}$

- MIMO: *t* transmit antennas, *r* receive antennas.
- Signal transmitted over *n* channel uses.
- Dimensions: $X \in \mathbb{C}^{n \times t}$, $\mathbb{Y} \in \mathbb{C}^{n \times r}$, $\mathbb{H} \in \mathbb{C}^{t \times r}$, and $\mathbb{W} \in \mathbb{C}^{n \times r}$.
- Entries of \mathbb{W} are IID $\mathcal{N}_{\mathbb{C}}(0,1)$.
- Quasi-static: fading coefficients are random but stay constant.

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Capacity vs. Outage

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Outage:

- $\Rightarrow\,$ Event that channel prohibits reliable communication at a given rate.
- ⇒ Suppose we communicate at SNR ρ , and let H = h (t = r = 1). For any rate $R < \log(1 + |h|^2 \rho)$ we have $\epsilon \to 0$ as $n \to \infty$.

$$\Rightarrow$$
 Outage if $R > \log(1 + |h|^2 \rho)$:

$$P_{\mathrm{out}}(R) \triangleq \Pr(\log(1+|H|^2
ho) < R)$$

 \Rightarrow Outage capacity is the supremum of all rates satisfying $P_{\rm out}(R) \leq \epsilon.$

L.H. Ozarow, S. Shamai (Shitz), A.D. Wyner, "Information theoretic considerations for cellular mobile radio," *IEEE Transactions on Vehicular Technology*, May 1994.

E. Biglieri, J. Proakis, S. Shamai (Shitz), "Fading channels: Information-theoretic and communciations aspects," *IEEE Transactions on Information Theory*, October 1998.

Outage Capacity and Delay Constraints

- "For stringent delay constraints [...] a natural information-theoretic performance measure is based on the capacity versus outage probability characteristics."
- "[With delay constraints], information outage probability, defined as the probability that the instantaneous mutual information of the channel is below the transmitted coding rate, is the appropriate performance limit indicator."
- "For practical systems with more stringent delay constraints, outage capacity is a more relevant metric."



Is there a coding theorem for outage capacity?

$(n, M, \epsilon)_{\ell}$ Code

- Different scenarios: no-CSI (no), CSIT (tx), CSIR (rx), CSIRT (rt)
- An $(n, M, \epsilon)_{\ell}$ code $(\ell = \{no, tx, rx, rt\})$ consists of the following:

Encoder: <u>No-CSI or CSIR</u>: $f: \{1, ..., M\} \to \mathbb{C}^{n \times t} \text{ s.t.}$ $\|f(m)\|_{\mathsf{F}}^2 \le n\rho, \quad \forall m$

Decoder: <u>No-CSI or CSIR:</u> $g : \mathbb{C}^{n \times t} \to \{1, \dots, M\}$ s.t. $\max_{w} \Pr(g(\mathbb{Y}) \neq W | W = w) \leq \epsilon$

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Encoder: $\underline{\text{CSIT or CSIRT:}}_{f: \{1, \dots, M\} \times \mathbb{C}^{n \times r} \to \mathbb{C}^{r \times t} \text{ s.t.} } \\ \|f(w, \mathsf{H})\|_{\mathsf{F}}^2 \le n\rho, \quad \forall w, \forall \mathsf{H}$

Decoder:
CSIT or CSIRT:

$$g : \mathbb{C}^{n \times r} \times \mathbb{C}^{r \times t} \to \{1, \dots, M\} \text{ s.t.}$$

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 $\Rightarrow\,$ maximum error probability, short-term power constraint <code>@Tobias Koch</code>

Maximal Achievable Rate

Maximal achievable rate defined as

$$R_{\ell}^{*}(n,\epsilon) \triangleq \sup \left\{ \frac{\log M}{n} : \exists (n, M, \epsilon)_{\ell} \text{ code} \right\}, \quad \ell = \{ \text{no, rx, tx, rt} \}$$

 What is the largest rate such that the probability of error is not larger than ε as n → ∞?

•
$$\epsilon$$
-capacity: $C_{\epsilon,\ell} = \lim_{n \to \infty} R_{\ell}^*(n,\epsilon)$

S. Verdú, T.S. Han, "A general formula for channel capacity," *IEEE Transactions on Information Theory*, July 1994.

M. Effros, A. Goldsmith, Y. Liang, "Generalizing capacity: New definitions and capacity theorems for composite channels," *IEEE Transactions on Information Theory*, July 2010.

Outage Capacity: CSIRT Case

Theorem (Caire, Taricco & Biglieri): Let $C_{\epsilon,\ell}$ be a continuous function of ϵ . Then

$$C_{\epsilon,\ell} = \lim_{n \to \infty} R_{\ell}^*(n,\epsilon) = \sup\{R \colon P_{\mathsf{out},\mathsf{tx}}(R) \le \epsilon\}, \quad \ell \in \{\mathsf{tx},\mathsf{rt}\}$$

where

$$\mathcal{P}_{\mathsf{out},\mathsf{tx}}(R) = \mathsf{Pr}\left(\max_{\mathsf{Q}} \mathsf{log}\,\mathsf{det}\left(\mathsf{I}_r + \mathbb{H}^{\dagger}\mathsf{Q}\mathbb{H}
ight) < R
ight)$$

denotes the outage probability optimized over all positive semidefinite matrices Q satisfying tr (Q) $\leq \rho$.

G. Caire, G. Taricco, E. Biglieri, "Optimum power control over fading channels," *IEEE Transactions* on *Information Theory*, July 1999.

Theorem (Telatar): Let $C_{\epsilon,\ell}$ be a continuous function of ϵ . Then

$$C_{\epsilon,\ell} = \lim_{n \to \infty} R_{\ell}^*(n,\epsilon) = \sup\{R \colon P_{\text{out},\text{no}}(R) \le \epsilon\}, \quad \ell \in \{\text{rx},\text{no}\}$$

where

$$\mathcal{P}_{\mathsf{out},\mathsf{no}}(R) = \inf_{\mathsf{Q}} \mathsf{Pr}\left(\mathsf{log}\,\mathsf{det}\left(\mathsf{I}_r + \mathbb{H}^{\dagger}\mathsf{Q}\mathbb{H}\right) < R\right)$$

denotes the outage probability optimized over all positive semidefinite matrices Q satisfying tr (Q) $\leq \rho$.

E. Telatar, "Capacity of multi-antenna Gaussian channels," *European Transactions on Telecommunications*, November 1999.

CSI at the receiver doesn't help

- For a compound channel {*W_s*: *s* ∈ *S*}, knowledge of *s* at the receiver does not increase the capacity.
- Intuitively, by transmitting a training sequence of length $\propto \sqrt{n}$, the channel state can be estimated without rate loss.
- Claim follows also from our lower bounds on $R_{no}^*(n,\epsilon)$.

I. Csiszár, J. Körner, Information Theory: Coding Theorems for Discrete Memoryless Systems, New York: Academic, 1981.

E. Biglieri, J. Proakis, S. Shamai (Shitz), "Fading channels: Information-theoretic and communications aspects," *IEEE Transactions on Information Theory*, October 1998.

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Quasi-static MIMO fading channels at finite blocklength," submitted to *IEEE Transactions on Information Theory*.



Outage capacity for systems with stringent delay constraints?

Outage Capacity vs. Delay Constraints

- Outage capacity has operational meaning for $n \to \infty$.
- Quasi-static fading channel is reasonable if

 $n \ll$ coherence time of the channel.

- Suggests that
 - \Rightarrow delay is large.
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 $n \ll$ coherence time of the channel.

- Suggests that
 - \Rightarrow delay is large.
 - \Rightarrow coherence time is large.
- "As a matter of fact, outage probability predicts surprisingly well the error probability of actual codes for practical values of n."

G. Caire, G. Taricco, E. Biglieri, "Optimum power control over fading channels," *IEEE Transactions on Information Theory*, July 1999.

Fading Channels at Finite Blocklength

- Study how quickly $R^*_{\ell}(n,\epsilon) \to C_{\epsilon,\ell}$ as $n \to \infty$.
- For the Gaussian channel

$$R^*(n,\epsilon) = C - \sqrt{\frac{V}{n}}Q^{-1}(\epsilon) + \mathcal{O}\left(\frac{\log n}{n}\right)$$

 \Rightarrow V: channel dispersion

• What is the ϵ -dispersion of quasi-static fading channels?

Y. Polyanskiy, H.V. Poor, S. Verdú, "Channel coding rate in the finite blocklength regime," *IEEE Transactions on Information Theory*, May 2010.

MIMO Fading Channel with CSIT

Theorem: Assume that \mathbb{H} satisfies the following conditions: 1. $\mathbb{E}\left[\det(\mathbf{I}_t + \rho \mathbb{H}\mathbb{H}^{\dagger})\right] < \infty$.

 The joint PDF of the ordered nonzero eigenvalues of ℍ[†]ℍ exists and is continuously differentiable.

3.
$$P'_{out,tx}(C_{\epsilon,\ell}) > 0.$$

Then
 $R^*_{\ell}(n,\epsilon) = C_{\epsilon,\ell} + \mathcal{O}\left(\frac{\log n}{n}\right), \quad \ell \in \{tx, rt\}$

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$\Rightarrow \epsilon$ -dispersion is zero!

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Quasi-static MIMO fading channels at finite blocklength," submitted to *IEEE Transactions on Information Theory*.

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rt}

MIMO Fading Channel without CSIT

Theorem: Assume that the PDF of \mathbb{H} , denoted by $f_{\mathbb{H}}$, satisfies the following conditions:

- 1. $f_{\mathbb{H}}$ is smooth (has derivatives of all orders).
- 2. There exists a constant c such that $f_{\mathbb{H}}(\mathsf{H}) > 0$, $\|\mathsf{H}\|_{\mathsf{F}} < c$ and $f_{\mathbb{H}}(\mathsf{H}) = 0$, $\|\mathsf{H}\|_{\mathsf{F}} \ge c$. Then $(\log n)$

$$R_{\ell}^{*}(\epsilon, n) = C_{\epsilon,\ell} + \mathcal{O}\left(\frac{\log n}{n}\right), \quad \ell \in \{\mathrm{no}, \mathrm{rx}\}$$

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Stringent Conditions (?)

- MIMO case without CSIT is hard:
 - \Rightarrow Q minimizing Pr (log det (I_r + $\mathbb{H}^{\dagger}Q\mathbb{H}) < R$) is unknown.
 - $\Rightarrow\,$ outage capacity of MIMO fading channel with no CSIT still open.
- Second condition requires that $\|\mathbb{H}\|_{\mathsf{F}}$ is essentially bounded:
 - ⇒ not satisfied by common fading distributions (e.g., Rayleigh, Rician, Nakagami fading).
 - \Rightarrow c can be arbitrarily large—probably a mere technicality.
- For SIMO case conditions can be weakened.

E. Telatar, "Capacity of multi-antenna Gaussian channels," *European Transactions on Telecommunications*, November 1999.

SIMO Fading Channel without CSIT

Theorem: Assume that: 1. The PDF of $||\mathbb{H}||_F^2$ is continuously differentiable. 2. $P'_{out,no}(C_{\epsilon,\ell}) > 0$ Then $R_\ell^*(n,\epsilon) = C_{\epsilon,\ell} + O\left(\frac{\log n}{n}\right), \quad \ell \in \{rx, no\}$

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Quasi-static SIMO fading channels at finite blocklength," 2013 IEEE International Symposium on Information Theory (ISIT), Istanbul, Turkey.

SIMO Fading Channel without CSIT

Theorem: Assume that: 1. The PDF of $||\mathbb{H}||_{\mathsf{F}}^2$ is continuously differentiable. 2. $P'_{\mathsf{out},\mathsf{no}}(C_{\epsilon,\ell}) > 0$ Then $R^*_{\ell}(n,\epsilon) = C_{\epsilon,\ell} + \mathcal{O}\left(\frac{\log n}{n}\right), \quad \ell \in \{\mathsf{rx},\mathsf{no}\}$

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ϵ -Dispersion is zero!

$$R_{\ell}^*(n,\epsilon) = C_{\epsilon,\ell} + \mathcal{O}\left(\frac{\log n}{n}\right)$$

- Suggests fast convergence to outage capacity.
- Consistent with statement by Caire et al. that "outage probability predicts surprisingly well the error probability of actual codes for practical values of n."
- Continuity assumptions on the PDF of 𝔄 satisfied by most common fading distributions.
- Assumptions are violated for (nonfading) Gaussian channel
 ⇒ has in fact positive dispersion

A Numerical Example



SIMO Rician fading channel, r = 2, K-factor 20 dB, SNR = -1.55 dB, $\epsilon = 10^{-3}$

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Quasi-static MIMO fading channels at finite block-length," submitted to *IEEE Transactions on Information Theory*.

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Comparison with LTE-Advanced



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Turbo codes in LTE-Advanced (QPSK, 10 iterations of max-log-MAP decoder).

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Proof Outline: Achievability (1)

- Lower bound on $R_{\ell}^*(n, \epsilon)$ does not require CSIR.
- Consider physically degraded channel X → Ω_Y = span(Y)
 ⇒ has smaller R^{*}_ℓ(n, ϵ) than original channel X → Y.
- CSIT: water-filling power allocation.
- Apply $\kappa\beta$ bound.
- Use as hypothesis test $Z_X(\Omega_{\mathbb{Y}}) = I\{\sin^2\{\operatorname{span}(X), \Omega_{\mathbb{Y}}\} \le \gamma_n\}$ $\Rightarrow \gamma_n = e^{-C_{\epsilon,\ell} + \mathcal{O}(1/n)}$
 - $\Rightarrow \ \text{sin}\{\mathcal{A},\mathcal{B}\} \text{ extends the notion of angle between vectors to complex} \\ \text{subspaces using the concept of principal angles}$

Y. Polyanskiy, H.V. Poor, S. Verdú, "Channel coding rate in the finite blocklength regime," *IEEE Transactions on Information Theory*, May 2010.

Proof Outline: Achievability (2)



Proof Outline: Converse

- Upper bound on R_{ℓ}^* requires CSIR.
- CSIT: transform MIMO channel into $\min\{t, r\}$ parallel channels.
- Apply meta-converse theorem.
- Use auxiliary channel whose output is circularly-symmetric, complex Gaussian with message-dependent variance.
- MIMO case without CSIT is technically much more involved.

Y. Polyanskiy, H.V. Poor, S. Verdú, "Channel coding rate in the finite blocklength regime," *IEEE Transactions on Information Theory*, May 2010.

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Dispersion of quasi-static MIMO fading channels via Stokes' theorem," submitted to 2014 IEEE International Symposium on Information Theory (ISIT).

Conclusions

- Channel dispersion of quasi-static MIMO fading channel is zero irrespective of availability of CSI.
- Suggests fast convergence to outage capacity
 ⇒ outage capacity as metric for systems with delay constraints.
- Supports observation that outage probability describes accurately the performance over quasi-static fading channels of actual codes.

Further Literature

Dispersion of SISO stationary fading channels with CSIR:

Y. Polyanskiy, S. Verdú, "Scalar coherent fading channel: dispersion analysis," 2011 IEEE International Symposium on Information Theory (ISIT), St. Petersburg, Russia.

Finite-blocklength bounds for block-fading channels:

W. Yang, G. Durisi, T. Koch, Y. Polyanskiy, "Diversity versus channel knowledge at finite blocklength," 2012 IEEE Information Theory Workshop (ITW), Lausanne, Switzerland.

Second-order coding rate for quasi-static MIMO Rayleigh-fading channels when $\{t, r\} \propto n$:

J. Hoydis, R. Couillet, P. Piantanida, "The second-order coding rate of the MIMO Rayleigh block-fading channel," submitted to *IEEE Transactions on Information Theory*.

Quasi-static fading channel with long-term power constraints:

W. Yang, G. Caire, G. Durisi, Y. Polyanksiy, "Finite blocklength channel coding rate under a long-term power constraint," submitted to 2014 IEEE International Symposium on Information Theory (ISIT).