



# An Improved Lower Bound on Rate for Variable-length Codes with Active Feedback

Adam R. Williamson and Richard D. Wesel



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Communication Systems Laboratory (<http://www.ee.ucla.edu/~csl/>), Department of Electrical Engineering, University of California, Los Angeles

## Overview

- **Main result:** Improved lower bound on maximum rate of variable-length feedback codes at short blocklengths
- Previous lower bound [Polyanskiy, Poor and Verdú, 2011]: stop-feedback codes, left large gap to upper bound
- New approach: “active” feedback to confirm receiver’s estimate
- Numerical results provided for BSC

## VLF Codes

An  $(l, M, \epsilon)$  **variable-length feedback (VLF) code** consists of [Polyanskiy, Poor and Verdú, 2011]:

- Message  $W \in \{1, 2, \dots, M\}$
- Average blocklength  $l$ :  $E[\tau] \leq l$
- $\tau$  is a stopping time of the filtration  $\sigma\{U, Y_1, Y_2, \dots\}$
- $U$  is common randomness revealed to both Tx and Rx
- Encoder outputs  $X_n = f_n(U, W, Y_1, Y_2, \dots, Y_{n-1})$
- Memoryless channel  $P(Y_i | X_1, \dots, X_i) = P(Y_i | X_i)$
- Decoder’s estimates  $g_n(U, Y_1, \dots, Y_n)$
- Decoder’s final decision  $\hat{W} = g_\tau(U, Y_1, \dots, Y_\tau)$
- Average probability of error  $\epsilon$  s.t.  $P[\hat{W} \neq W] \leq \epsilon$
- Code rate is  $(\log M) / l$

## Stop-feedback

### Stop-feedback VLF code:

- Tx ignores feedback except to learn when Rx stops transmission (decodes)
- Encoder outputs  $X_n = f_n(U, W)$
- Also called **decision feedback** (ACK/NACK from Rx)

### Finite-blocklength regime:

- Feedback improves the maximum rate at short blocklengths compared to no-feedback case. (Fig. 1)
- Large gap between lower (achievability) and upper (converse) bounds on rate.
- Best achievability result for DMCs based on stop-feedback codes – Doesn’t consider what receiver knows!

[PPV’11]: Y. Polyanskiy, H. V. Poor, and S. Verdú, “Feedback in the non-asymptotic regime,” IEEE Trans. Inf. Theory, 2011.

## Stop-feedback Bound

### Theorem: (Stop-feedback) Achievability [PPV’11, Thm. 3]

For a scalar  $\gamma > 0$ , there exists an  $(l, M, \epsilon)$  VLF code satisfying

$$l \leq E[\tau]$$

$$\epsilon \leq (M - 1) P[\bar{\tau} \leq \tau],$$

$$\tau = \inf\{n \geq 0: i(X^n; Y^n) \geq \gamma\},$$

$$\bar{\tau} = \inf\{n \geq 0: i(\bar{X}^n; Y^n) \geq \gamma\}.$$

- $i(X^n; Y^n)$  is the information density between codeword  $X^n$  and channel output  $Y^n$ .
- $i(\bar{X}^n; Y^n)$  is the information density between identically-distributed codeword  $\bar{X}^n$  and channel output  $Y^n$ .
- *Proof:* Random coding argument.

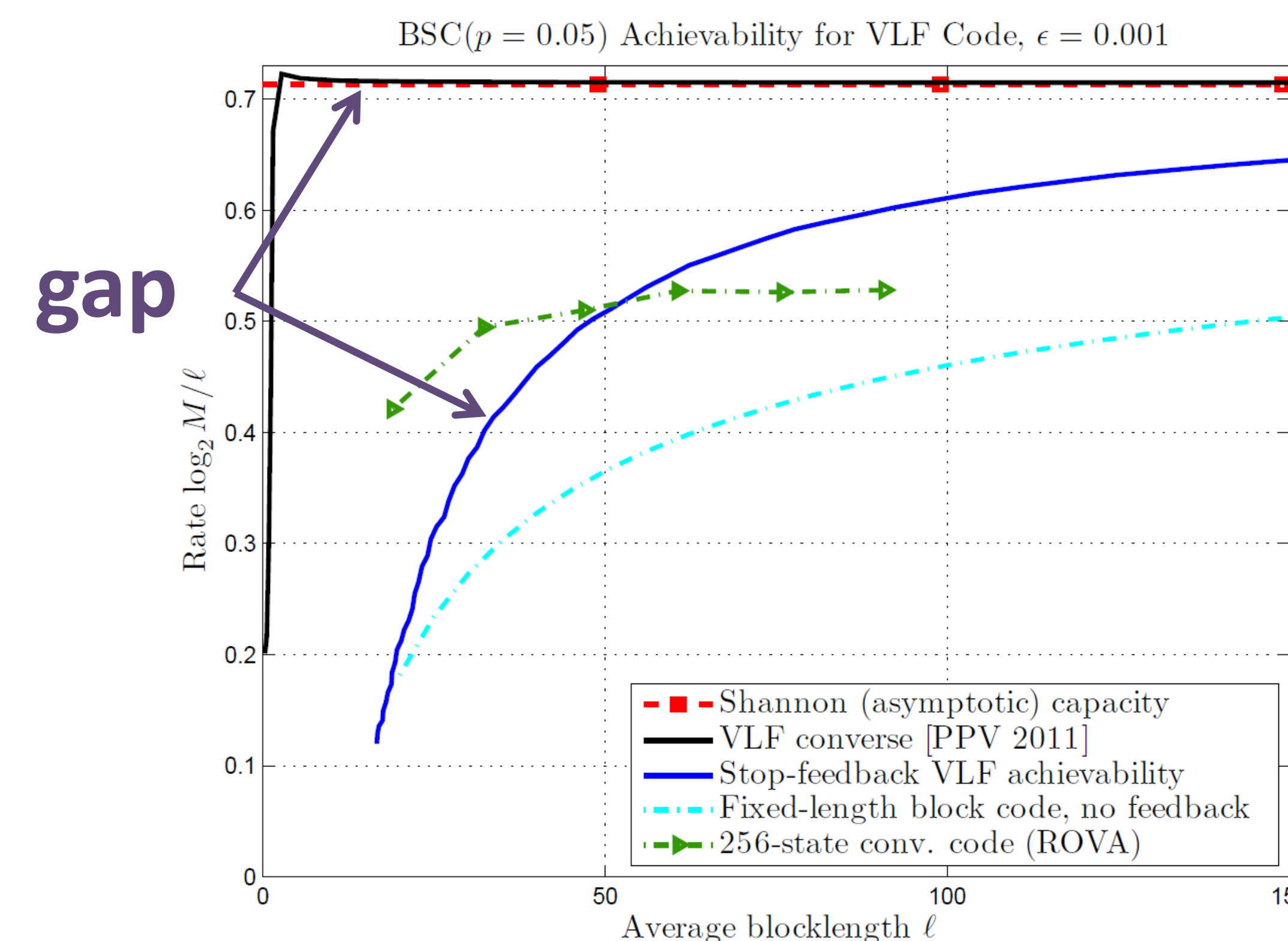


Fig. 1: Gap between upper and lower bounds on max. rate at short blocklengths. Feedback provides improvement vs. no-feedback. ROVA = Reliability Output Viterbi Algorithm [ISIT ‘13].

## “Active” Feedback

- Transmitter uses feedback to refine receiver’s tentative estimate.
- In general,  $f_n(U, W, y^{n-1}) \neq f_n(U, W, \tilde{y}^{n-1})$ , when  $y^{n-1} \neq \tilde{y}^{n-1}$
- Channel coding is a specific case of **active sequential hypothesis testing** [Naghshvar and Javidi, 2012].
- Benefit of active feedback called **adaptivity gain**.
- Active feedback also called **information feedback**.

[ISIT ‘13]: A. R. Williamson, T.-Y. Chen, and R. D. Wesel, “Reliability-based error detection for feedback communication with low latency,” IEEE Int. Symp. Inf. Theory, 2013.

[Naghshvar and Javidi, 2012]: M. Naghshvar and T. Javidi, “Sequentiality and adaptivity gains in active hypothesis testing,” arXiv, 2012.

## Improved Lower Bound

### Proposed scheme:

- Decoder feeds back estimate  $X^n$  once  $i(X^n; Y^n) \geq \gamma$  for some  $X^n$
- Tx uses  $N$  forward symbols to confirm (ACK) or deny (NACK) estimate
- Start over if Rx decodes NACK, stop when Rx decodes ACK
- $P[n \rightarrow a] = P\{\text{NACK decoded as ACK}\}$
- $P[a \rightarrow n] = P\{\text{ACK decoded as NACK}\}$
- $P(\text{NACK}) = P\{\text{Rx decodes NACK}\}$   
 $= P[n \rightarrow n]P\{\text{Rx est. wrong}\} + P[a \rightarrow n]P\{\text{Rx est. correct}\}$   
 $\leq P[n \rightarrow n](M-1)P[\bar{\tau} \leq \tau] + P[a \rightarrow n]$

### Theorem: Improved Achievability for Active Feedback

For a scalar  $\gamma > 0$  and integer  $N > 0$ , there exists an  $(l, M, \epsilon)$  VLF code satisfying

$$l \leq \frac{E[\tau] + N}{1 - P(\text{NACK})}$$

$$\epsilon \leq \frac{(M - 1) P[\bar{\tau} \leq \tau] P[n \rightarrow a]}{1 - P(\text{NACK})}.$$

- *Proof:* Similar to stop-feedback proof.
- Numerical evaluation (Fig. 2) requires optimization over  $\gamma$ ,  $N$ , and threshold  $N_t$  (threshold for skewed hypothesis test of confirmation block at Rx), for fixed  $M$  and  $\epsilon$ .

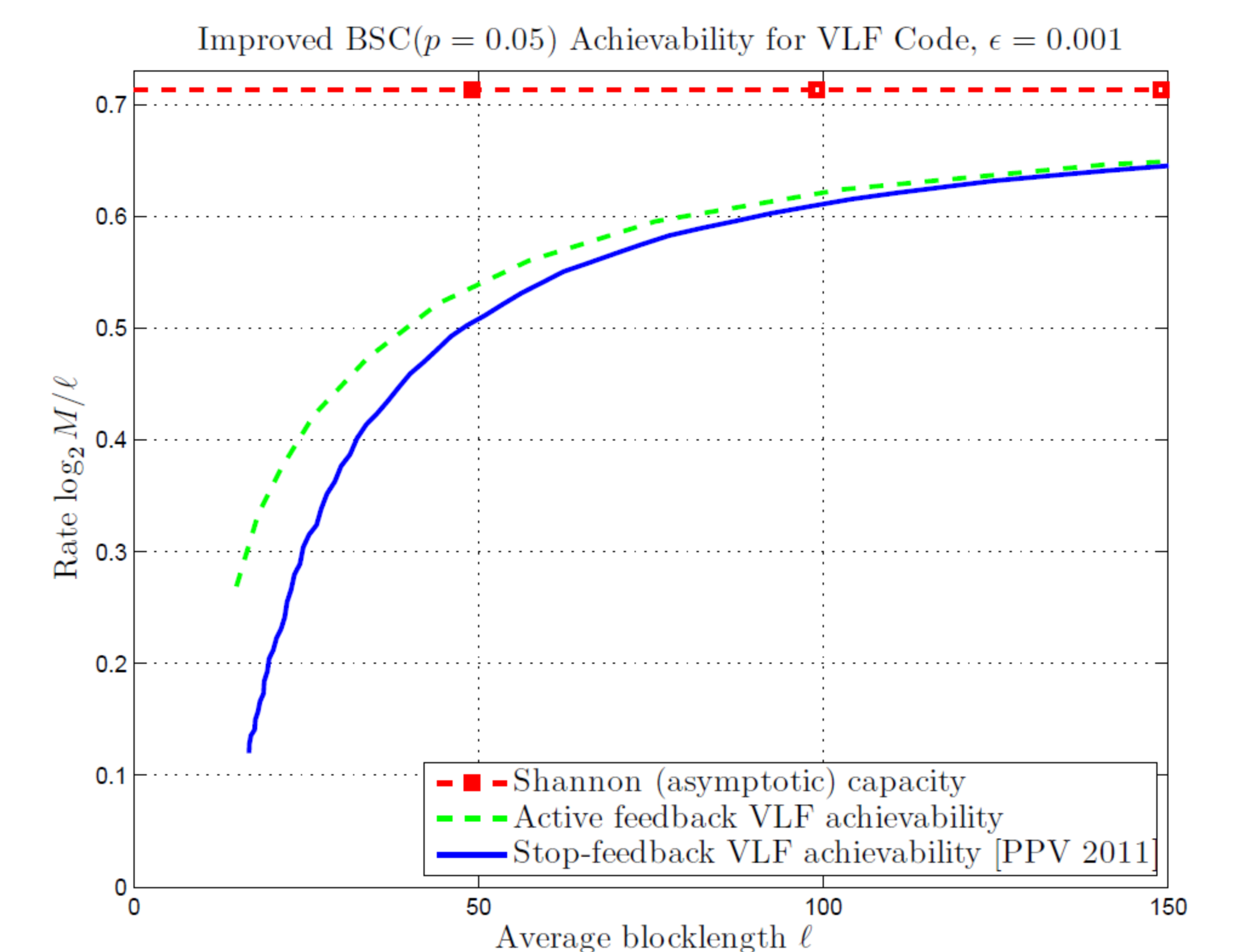


Fig. 2: Numerical evaluation of new “active” feedback lower bound.

### Discussion

- Can do better by refining Rx estimate sequentially, not just at  $\tau$
- Starting over after NACK is costly in terms of latency
- Still need to find “good” codes
- There may be encoder complexity challenges