

# Impacts of SW-ARQ on the Latency and Reliability of Diffusive, In-sequence Molecular Communication

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**Abstract**—This paper studies a feedback-based communication protocol for bio-nanomachines to reliably transmit and receive a series of molecular messages through diffusive transports in a particular order. Based on the Stop-and-Wait Automatic Repeat Request (SW-ARQ) mechanism, the proposed protocol leverages redundant molecule transmissions, molecule delivery acknowledgement and timeout-based retransmissions to enhance the latency and reliability of in-sequence molecular communication. Simulation results demonstrate that the protocol substantially improves latency, jitter and transmission failure rate. They also illustrate how environmental and protocol parameters impact those communication performance metrics.

## I. INTRODUCTION

Diffusive molecule propagation is known inherently unreliable, and therefore it causes extremely long latency, large jitter, high molecule loss rate and low capacity in molecular communication [1–3]. This paper addresses the reliability issue in diffusive, aqueous molecular transports and studies a communication protocol for bio-nanomachines to reliably transmit and receive a series of *information molecules*, which encode and carry information by means of molecules, in a particular order.

Reliable in-sequence molecule delivery can play critical roles in various biomedical and healthcare applications. For artificial morphogenesis applications in regenerative medicine, bio-nanomachines made of living cells are designed to divide and grow to form three-dimensional multi-cellular structures such as tissues and organs. Molecular communication allows those bio-nanomachines to communicate with each other using *artificial morphogens*, which are modeled as the information molecules that encode morphological information. Reliable in-sequence molecule delivery is a critical foundation to reliably control communication patterns (e.g., the order of propagated artificial morphogens and the interval of artificial morphogen propagation) for adjusting the growth and differentiation of bio-nanomachines.

In order to facilitate reliable in-sequence molecular communication, the proposed protocol employs Stop-and-Wait Automatic Repeat Request (SW-ARQ) [4], which is feasible enough to realize with simple computation and memory functions in bio-nanomachines. It performs *bi-directional* interactions between a transmitter (Tx) bio-nanomachine and a receiver (Rx) bio-nanomachine. The Tx bio-nanomachine duplicates

an information molecule and transmits them to the Rx bio-nanomachine. Upon receiving one of them, the Rx transmits duplicated acknowledgement (ACK) molecules to the Tx. The arrival of an ACK molecule at the Tx indicates that the Rx has received an information molecule that is associated with the ACK molecule. This ACK arrival triggers the Tx to transmit the next information molecule(s). If the Tx never receive ACK molecules within a timeout period, it re-transmits duplicated information molecules to the Rx.

This paper evaluates the proposed protocol through simulations that are configured with biologically-feasible parameters. The simulation study analyzes how the proposed protocol impacts communication performance, namely latency, jitter and failure rate, in comparison to traditionally major molecule transmission schemes such as single-molecule transmission and duplication-based transmission. Compared to a duplication-based transmission scheme, which does not involve ACK-based retransmissions, the proposed protocol gains 1.28x speedup in latency, reduces latency jitter by 38.7% and reduced transmission failure rate by 70%. Simulation results also reveal how environmental parameters (e.g., Tx-to-Rx distance) and protocol parameters (e.g., retransmission timeout period) impact communication performance and other characteristics such as energy consumption.

## II. RELATED WORK

Nakano et al. [5] and Felicetti et al. [6] study feedback-based rate control schemes for molecule propagation in diffusive transports. Those schemes are designed to ensure delivering a given number of information molecules to the Rx while preventing the Tx from transmitting the molecules faster than the Rx reacts. While in-sequence delivery of information molecules is out of the scope in [5, 6], this paper focuses on an in-sequence and at-least-once delivery semantics.

In-sequence molecular transmission is studied with SW-ARQ schemes for diffusive transport in [7] and bacterial communication in [8]. This paper is similar to [7, 8] in that the two papers utilize SW-ARQ. However, unlike [7, 8], this paper examines SW-ARQ in collisional environments where molecules collide with each other. This paper extends [9] by reporting an extended set of simulation results that are obtained with more reasonable simulation configurations.



Figs 5 and 6 show how the median RTT and RTT jitter change as the redundancy in molecule propagation ( $n$ ) varies. The jitter of RTT is measured as the standard deviation of RTT results. Both the median RTT and RTT jitter greatly improve as  $n$  increases. Note that RTT jitter stays very high regardless of  $n$ ; it is similar to, or even higher than, the median RTT. For example, when  $n = 20$  and  $d = 90 \mu\text{m}$ , the median RTT is 263,186 seconds (73.1 hours) and RTT jitter is 280,603 seconds (77.9 hours).

Fig. 7 illustrates how the rate of message transmission failure changes as the redundancy in molecule propagation ( $n$ ) varies. A message transmission is considered failed if RTT exceeds the median RTT. As shown in Fig. 7, the failure rate decreases as  $n$  increases. When  $d = 30 \mu\text{m}$ , the failure rate reaches zero with  $n = 100$ . However, when  $d = 90 \mu\text{m}$ , the failure rate stays higher than 50% even with  $n = 100$ .

For the subsequent simulations, the redundancy in molecule propagation ( $n$ ) is set to 20. This parameter setting is well-balanced with respect to communication performance (median RTT and RTT jitter), communication reliability (message transmission failure rate) and energy consumption. When  $n = 20$ , communication performance is significantly preferable compared to the case with  $n = 1$  and close enough to the cases with  $n > 20$  (Figs. 5 and 6). When  $n = 20$ , the average number of molecule-to-molecule collisions in a simulation is sufficiently low (Fig. 8). However, when  $n > 20$ , the number of collisions exponentially increases, which implies significantly higher risks to increase RTT jitter. Higher redundancy in molecule propagation ( $n$ ) requires higher (chemical) energy consumption for Tx and Rx to duplicate molecules. Fig. 9 shows how much energy Tx and Rx spend for a message transmission with  $n$  information molecules and  $n$  acknowledgment molecules. Energy consumption is computed as  $\Delta G^\circ \times p \times 2n$ .  $\Delta G^\circ$  is 45.6 kJ/mol where  $mol = 6.022 \times 10^{-23}$ .  $p$  denotes the number of nucleobase pairs in a molecule (Table I).

Molecule retransmission is enabled (RTO $\neq\infty$ ) in the subsequent simulations. The maximum number of retransmissions for each information/acknowledgement is set to 5 (Table I). The following four schemes are examined to configure retransmission timeout (RTO):

- RTO-1:  $2 \times RTT_{med}$
- RTO-2:  $RTT_{med} + \frac{1}{3} \times RTT_{std}$
- RTO-3:  $RTT_{med} + \frac{1}{2} \times RTT_{std}$
- RTO-4:  $RTT_{med} + RTT_{std}$

$RTT_{med}$  and  $RTT_{std}$  denote the median RTT and the standard deviation of RTT, which are captured from Figs. 4 and 6. Fig. 10 illustrates the RTO periods configured with the above schemes.

Fig. 11 shows the median RTT with different RTO schemes ( $n = 20$ ). RTT improves with all RTO schemes (RTO-1 to RTO-4) in comparison to the case where molecule retransmission is disabled (RTO-0). RTO-2 yields the lowest RTT regardless of the Tx-to-Rx distance ( $d$ ). Compared to RTO-0, RTO-2 improves RTT by 83,153 seconds (23 hours) when  $d = 90 \mu\text{m}$ . RTO-2 gains 1.28x speedup over RTO-0. Fig. 12 shows RTT jitter with different RTO schemes.

RTT jitter improves with all RTO schemes in comparison to RTO-0. RTO-2 yields the lowest RTT jitter regardless of  $d$ . When  $d = 90 \mu\text{m}$ , RTO-2 reduces RTT jitter by 38.7 %, compared to RTO-0. Fig. 13 illustrates the rate of message transmission failure with different RTO schemes ( $n = 20$ ). A message transmission is considered failed if a message is not delivered with up to five retransmissions. Message transmission failure rate reaches zero in all RTO schemes. In comparison, when message retransmission is disabled (Fig. 7), message transmission failure rate is over 70 % ( $n = 20$  and  $d = 90 \mu\text{m}$ ). Message retransmission substantially aids to decrease the failure rate.

In summary, Figs. 11, 12 and 13 demonstrate that the proposed SW-ARQ protocol successfully enhances the performance and reliability of in-sequence molecular communication in diffusive transports.

## V. CONCLUSION

This paper considers diffusive molecular communication transports and studies a feedback-based communication protocol with the Stop-and-Wait Automatic Repeat Request (SW-ARQ) mechanism. By means of redundant molecule transmissions, molecule delivery acknowledgement and timeout-based retransmissions, the proposed protocol is designed to enhance the reliability of molecular communication. Simulation results demonstrate that the proposed protocol significantly improves the latency, jitter and transmission failure rate in in-sequence message transmissions.

## REFERENCES

- [1] M. Pierobon and I. F. Akyildiz, "Diffusion-based noise analysis for molecular communication in nanonetworks," *IEEE Trans. Signal Process.*, vol. 59, no. 6, 2011.
- [2] K. V. Srinivas, R. S. Adve, and A. W. Eckford, "Molecular communication in fluid media: The additive inverse gaussian noise channel," *IEEE Trans. Inf. Theory*, vol. 58, no. 7, 2012.
- [3] T. Furubayashi, T. Nakano, A. Eckford, Y. Okaie, and T. Yomo, "Packet fragmentation and reassembly in molecular communication," *IEEE Trans. NanoBiosci.*, vol. 15, no. 3, 2016.
- [4] H. O. Burton and D. D. Sullivan, "Errors and error control," *Proc. of the IEE*, vol. 60, no. 11, 1972.
- [5] T. Nakano, Y. Okaie, and A. V. Vasilakos, "Transmission rate control for molecular communication among biological nanomachines," *IEEE J. Sel. Area Comm.*, vol. 31, no. 12, pp. 835–846, 2013.
- [6] L. Felicetti, M. Femminella, G. Reali, T. Nakano, and A. V. Vasilakos, "TCP-like molecular communications," *IEEE J. Sel. Area Comm.*, vol. 32, no. 12, pp. 2354–2367, 2014.
- [7] X. Wang, M. D. Higgins, and M. S. Leeson, "Simulating the performance of SW-ARQ schemes within molecular communications," *Simulation Modelling Practice and Theory*, vol. 42, 2014.
- [8] C. Bai, M. S. Leeson, and M. D. Higgins, "Performance of SW-ARQ in bacterial quorum communications," *Nano Commun. Netw.*, vol. 6, no. 1, 2015.
- [9] J. S. Mitzman, B. Morgan, T. M. Soro, J. Suzuki, and T. Nakano, "A feedback-based molecular communication protocol for noisy intrabody environments," in *17th IEEE Int'l Conference on E-health Networking Applications and Services*, 2015.
- [10] M. E. Ortiz and D. Endy, "Engineered cell-cell communication via DNA messaging," *J. Biol. Eng.*, vol. 6, no. 16, 2012.
- [11] Y. Erlich and D. Zielinski, "DNA fountain enables a robust and efficient storage architecture," *Science*, vol. 355, no. 6328, pp. 950–954, 2017.
- [12] D. E. Smith, T. T. Perkins, and S. Chu, "Dynamical scaling of DNA diffusion coefficients," *Macromolecules*, vol. 29, 1996.

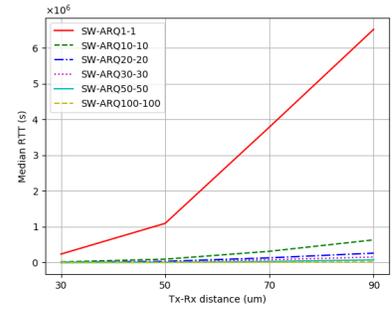
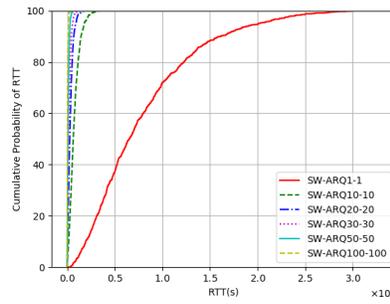
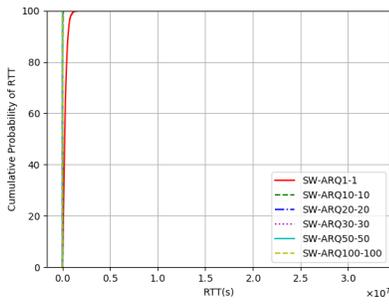


Fig. 2. RTT Probability Distribution.  $d=30\mu\text{m}$ . Fig. 3. RTT Probability Distribution.  $d=90\mu\text{m}$ . Fig. 4. Median RTT under Different Tx-Rx distances ( $d$ ).  $\text{RTO}=\infty$ .

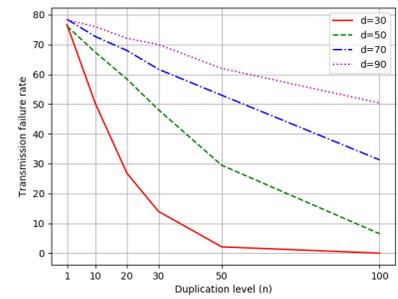
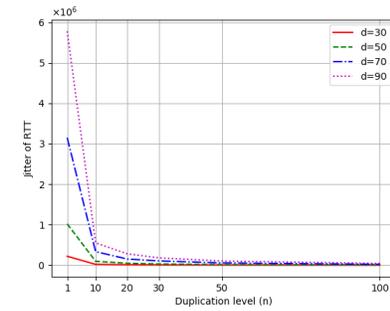
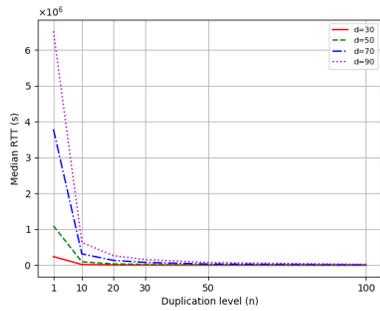


Fig. 5. Median RTT under Different Duplication Levels ( $n$ ).  $\text{RTO}=\infty$ . Fig. 6. RTT Jitter under Different Duplication Levels ( $n$ ).  $\text{RTO}=\infty$ . Fig. 7. Message Transmission Failure Rate (%) under Different Duplication Levels ( $n$ ).  $\text{RTO}=\infty$ .

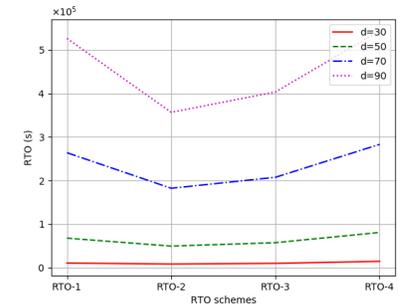
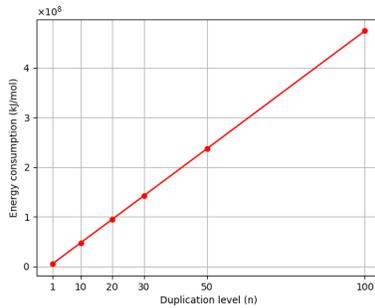
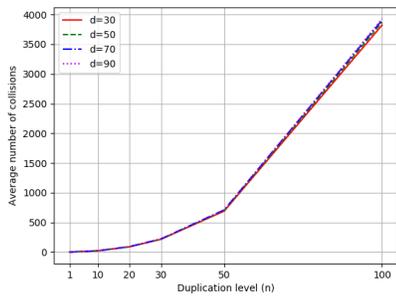


Fig. 8. Average Number of Collisions under Different Duplication Levels ( $n$ ).  $\text{RTO}=\infty$ . Fig. 9. Energy Consumption under Different Duplication Levels ( $n$ ).  $\text{RTO}=\infty$ . Fig. 10. Retransmission TimeOut (RTO) Periods in Different RTO Setting Schemes.

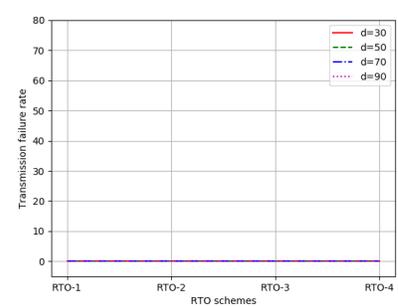
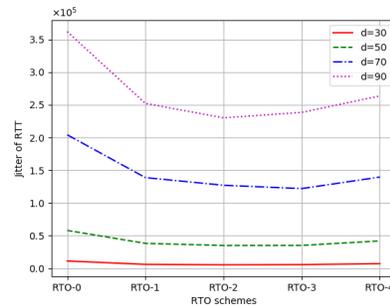
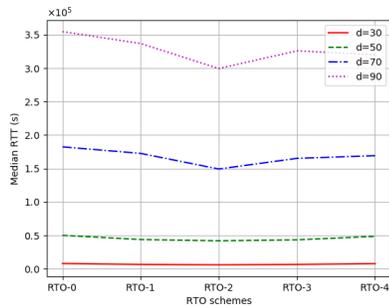


Fig. 11. Median RTT under Different RTO Schemes.  $\text{RTO}\neq\infty$ . Fig. 12. RTT Jitter under Different RTO Schemes.  $\text{RTO}\neq\infty$ . Fig. 13. Message Transmission Failure Rate under Different RTO Schemes.  $\text{RTO}\neq\infty$ .