



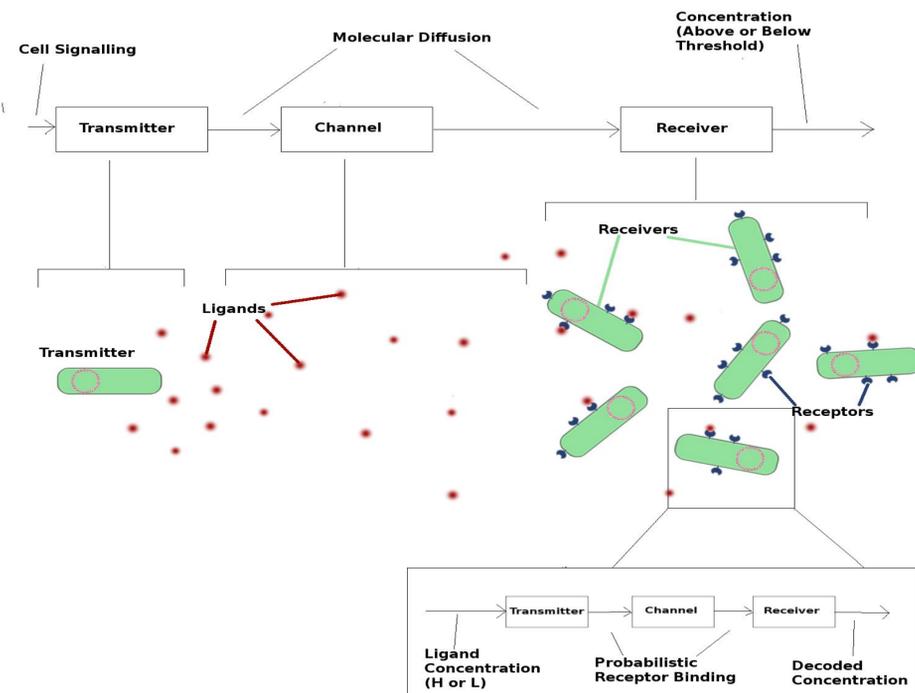
# An Information Theoretic Model of Engineered Cell-Cell Communication

Akshay Maheshwari, Anton Jackson-Smith, Matthew Feldman

## 1. Introduction

- The engineering of communicating biological cell swarms is limited by a lack of theoretical design principles
- We develop an information-theoretic model of cell-cell communication to:
  - Determine the information capacity of groups of communicating cells
  - Understand bottlenecks in cellular communication
  - Derive general design principles

## 2. Model



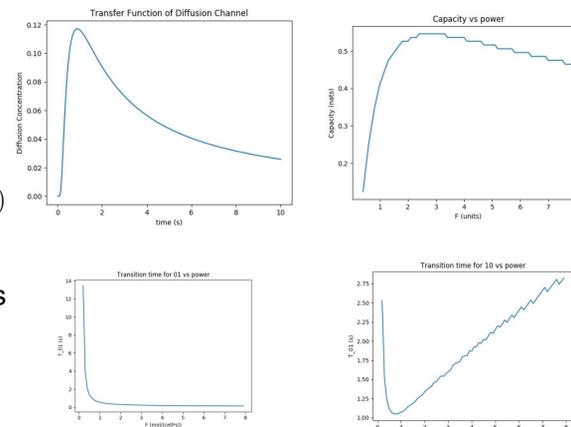
## 4. Analysis

### Diffusion Channel

The diffusion channel is a memory-channel with a transfer function given by Fick's second law:

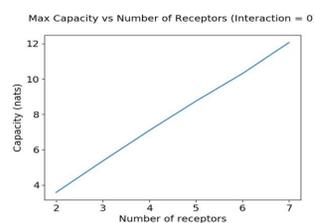
$$\frac{\partial c(x, t)}{\partial t} = D \nabla^2 c(x, t) + r(x, t)$$

The input is encoded as low or high concentrations (1 bit). Transition time is shown for 0→1 and 1→0 signal sequences [2].



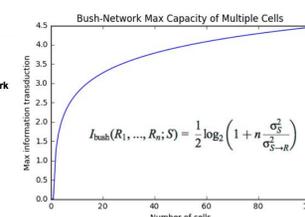
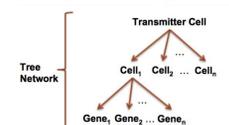
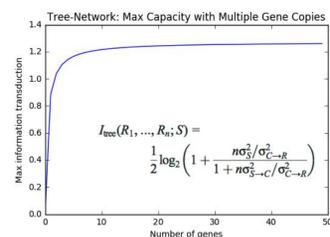
### Multiple receptors

$$0 \xrightleftharpoons[\tau\beta]{} 1 \xrightleftharpoons[2\tau\beta]{} 2 \dots k \xrightleftharpoons[(k+1)\tau\beta]{} k+1 \dots n-1 \xrightleftharpoons[n\tau\beta]{} n$$



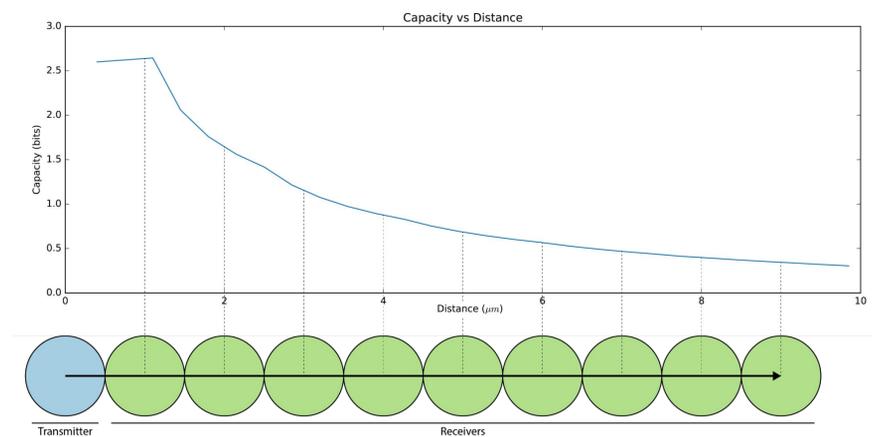
A cell with n receptors can be in any of n+1 states, where state k means any k receptors are bound. The transition diagram is shown above. Capacity for receiving cells with n independent receptors is n-times greater than cells with single receptors, and IID input maximizes capacity (left) [1].

### Multiple receiver cells & gene copies

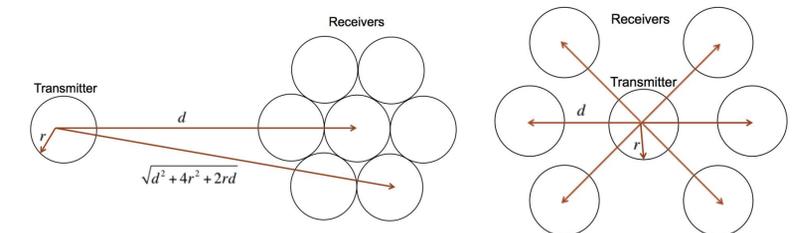


Information rate in signaling pathways such as TNF- $\alpha$  is limited by receiver receptors [3]. We model multiple receiving cells as a bush network to evaluate maximal improvements in capacity with multiple cells. Multiple copies of genes involved with intracellular signaling gives diminishing capacity gains because of the tree network structure.

## 5. Results



The capacity of receiver cells decreases with increasing distance from the transmitter. This is due to greater saturation of the memory-channel with greater distance.



We calculate the average information rate possible from one cell to a group of distant cells to be 0.88 bits/cell on average based on distance = 4 $\mu$ m, and from one cell to a surrounding group of six cells to be 3.9 bits total using a fixed distance of 1 $\mu$ m and the bush network model. We approximate the maximum possible information rate of a cell with a biologically relevant number of receptors (10,000 receptors for E. coli) to be 25,778 bits—this capacity is not limiting. Finally, we calculate the theoretical maximal information flux across a 1 mm colony of 150,000 E. coli, each cell receiving independent inputs from 6 neighbors, to be 271,103 bits. This synthesis provides a basis for designing simple cell-cell communication systems.

## 6. References

- [1] P. J. Thomas and A. W. Eckford. Shannon Capacity of Signal Transduction for Multiple Independent Receptors. *Proc. IEEE ISIT*. 2016-April.
- [2] A. Einolghozati, M. Sardari, A. Beirami, and F. Fekri. *Proc. IEEE ISIT*. 723-727, 2011-Aug.
- [3] Cheong, Raymond, et al. "Information transduction capacity of noisy biochemical signaling networks." *science* 334.6054 (2011): 354-358.