### ARTICLE



### Decoding the chemotactic signal

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#### Abstract

From an individual bacterium to the cells that compose the human immune system, cellular chemotaxis plays a fundamental role in allowing cells to navigate, interpret, and respond to their environments. While many features of cellular chemotaxis are shared among systems as diverse as bacteria and human immune cells, the machinery that guides the migration of these model organisms varies widely. In this article, we review current literature on the diversity of chemoat-tractant ligands, the cell surface receptors that detect and process chemotactic gradients, and the link between signal recognition and the regulation of cellular machinery that allow for efficient directed cellular movement. These facets of cellular chemotaxis are compared among *E. coli*, *Dictyostelium discoideum*, and mammalian neutrophils to derive organizational principles by which diverse cell systems sense and respond to chemotactic gradients to initiate cellular migration.

#### KEYWORDS

chemotaxis, communication theory, G protein-coupled receptor, methyl-accepting chemotaxis protein receptor

### 1 | INTRODUCTION

#### 1.1 | Cell communication and movement

Biological organisms are open systems, exchanging energy and matter with the environment during replication, growth, reproduction, and death. These exchanges of energy and matter play out on the organismal level as well as the cellular level. Just as ants perceive and respond to their environments by interpreting and depositing pheromones, individual cells similarly communicate with their environments through the bidirectional exchange of biological information across the cell membrane.<sup>1–3</sup> To ensure survival, a cell must be able to not only sense the state of the surrounding extracellular space (e.g., the presence or absence of nutrients), but to also enact an appropriate response (e.g., modification of cellular metabolism). Both prokaryotic and eukaryotic cells have evolved remarkably elegant communication systems for such purposes, and these sophisticated systems directly allow for the existence of complex cellular communities and multicellular organisms.

Importantly, cells are not static entities. When Robert Hooke peered through his microscope at a thin piece of cork, and, for the first time, described the biologic 'cell',<sup>4</sup> he failed to appreciate the dynamic capabilities of living cells (the piece of cork he was observing was no

longer living). The discovery that cells are motile entities was made contemporaneously by Antoni van Leeuwenhoek, who aptly described the animate behavior of the 'little animalcules' (microorganisms) he observed.<sup>5</sup> Cellular movement is essential for nearly all cell types and enables diverse biologic phenomena ranging from the sourcing of nutrients by bacteria to leukocyte recruitment during inflammation.<sup>6</sup>

## **1.2** | The diversity and complexity of directed migration

Directed migration occurs on multiple scales. The migration of alphaproteobacteria in response to the earth's magnetic field,<sup>7</sup> the migration of neurons in the developing brain,<sup>8</sup> and even the remarkable seasonal migration of bar-tailed godwits,<sup>9</sup> follow a common process: in each case, the organism interprets and responds to an environmental cue to guide its migratory route. In the context of individual cells, migration can be stimulated by incredibly diverse environmental cues, including light (i.e., *phototaxis*<sup>10</sup>), chemicals (i.e., *chemotaxis*<sup>11</sup>), temperature (i.e., *thermotaxis*<sup>12</sup>), stiffness (i.e., *durotaxis*<sup>13</sup>), electric fields (i.e., *electrotaxis*<sup>14</sup>), or even gravity (i.e., *gravitaxis*<sup>15</sup>). Importantly, cells do not typically have tactic responses when exposed to constant levels of environmental stimuli but migrate only in response to temporal or spatial gradients. Though gradient-sensing capabilities exist

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**FIGURE 1** A communication model for cellular chemotaxis in prokaryotic and eukaryotic systems. (A) The Shannon-Weaver model of communication. The input of the prokaryotic (B) and eukaryotic (C) chemotactic communication system can be considered the interaction of the message (i.e., chemoeffector) and the transmitter (i.e., chemoattractant receptor). The input is transmitted over a noisy channel (i.e., intracellular signaling cascades) to a receiver which decodes and reproduces the message in such a way to cause directed cellular movement. Prokaryotic and eukaryotic chemotactic communication systems use different messages and transmitters to achieve the same outcome (i.e., cellular migration). The objective of this review is to highlight the similarities and differences of the chemotactic input for prokaryotic and eukaryotic systems

in nearly all cells, the respective mechanisms by which prokaryotic and eukaryotic cells sense external gradients differ. Due to their small size, prokaryotes sense gradients temporally by randomly tumbling until they stochastically arrive at a region of higher stimulus concentration (i.e., moving "up" the gradient), at which point they decrease their tumbling rate to prolong movement toward the stimulus.<sup>16-18</sup> In contrast, eukaryotic cells integrate both temporal and spatial information to sense gradients, utilizing cell surface receptor occupancy and complex intracellular signaling pathways to measure the stimulant concentration difference between the ends of the cell.<sup>19-21</sup>

Chemotaxis, the directed migration of cells in response to a chemical stimulus, is critical for the survival of cells and organisms alike. Prokaryotic chemotactic mechanisms have been most extensively studied in *Escherichia coli*, where a relatively simple signaling cascade promotes the counterclockwise or clockwise rotation of flagella to produce either forward motion or tumbles, respectively.<sup>18,22,23</sup> Eukaryotic chemotactic mechanisms have been most extensively studied in the amoeboid *Dictyostelium discoideum* and mammalian neutrophils, where chemoattractants trigger intricate signaling cascades contributing to diverse cellular processes including the establishment of cellular polarity and extension of the cell membrane.<sup>17,19,24,25</sup> Both prokaryotic and eukaryotic cells exhibit unique morphologic modes of migration (e.g., swarming for prokaryotes; collective cell migration for eukaryotes) depending on cell type and environment,<sup>26–28</sup> increasing the complexity surrounding the study of chemotaxis.

#### **1.3** Chemotaxis as a cellular communication system

One approach to simplify the complex phenomenon of chemotaxis is to visualize it as a cellular communication system<sup>29-33</sup> (Fig. 1). Claude Shannon, the father of communication theory, remarked in his landmark paper A Mathematical Theory of Communication, "The fundamental problem of communication is that of reproducing at one point either exactly or approximately a message selected at another point".34 In an effective communication system, a message must be faithfully encoded by a transmitter, sent over a channel (where it encounters noise), delivered to a receiver, and then reconstructed into the same (or approximately the same) message (Fig. 1A). For the cellular communication system resulting in chemotaxis, the message to be transmitted is the chemotactic signal, or more specifically the gradient of chemoattractant molecules along which a cell should migrate (Fig. 1B and C). The fundamental problem then, as Shannon described, is the decoding and processing of that message by the cell in such a way that it can be reproduced (i.e., the cell can move along the chemotactic gradient).

The focus of this review is on utilizing an information theoretical framework to help decode the chemotactic signal. Specifically, we will consider how prokaryotic (Fig. 1B) and eukaryotic (Fig. 1C) chemotaxis systems have remarkably diverse input *messages* yet are able to convey the same *meaning*, namely cellular movement along the chemoattractant gradient. Additionally, we will explore how chemoattractants and receptor systems work in tandem to generate a signal for transmission over the channel, and the implications of using a common *transmitter* 





**FIGURE 2** Messages and transmitters in prokaryotic and eukraryotic chemotactic systems. Chemotactic messages of prokaryotes and eukaryotes alike can be grouped by "type" (i.e., danger, communication, or nutrient signal) and each message is transmitted through an integral membrane protein shown here. Comparing the prokaryotic (A) messages shown (phenol, PDB ID: 5KBE; maltose, PDB ID: 1MPD; AI-2, PDB ID: 2HJ9) to their eukaryotic (B) counterparts (cAMP, PDB ID:5KJY; folate, PDB ID 4QLE; chemokine IL-8, PDB ID: 1IL8; LTB4, PDB ID 3ZUO; fMLP, PDB ID: 1Q70; C5a, PDB ID: 5B4P), the increased molecular size and complexity of eukaryotic messages can be appreciated. All messages for *Escherichia coli* are transmitted through the common MCP Receptor architecture shown (from top to bottom; ligand binding domain, PDB ID:4Z9H; HAMP domain, PDB ID: 3ZX6; signaling domain, PDB ID: 3JA6; CheA and CheW, PDB ID: 3JA6) which is considerably larger that of the eukaryotic transmitter (i.e., GPCR). No structures are available for *Dictyostelium discoideum* GPCRs, G proteins, or arrestin domain-containing proteins (ADC), so shown are mammalian examples (GPCR and G Protein, PDB ID: 3SN6; ADC, PDB ID: 4R7X). For mammalian neutrophils, shown is an example of a chemokine receptor (CCR5, PDB ID: 4MBS), the heterotrimeric G protein (PDB ID: 3SN6), and  $\beta$ -arrestin 1 (PDB ID: 4JQI). Arrows shown indicate which proteins are thought to begin transmission through the noisy channel (i.e., begin the intracellular signaling cascades). The arrow below ADC is in light gray as it is unclear whether or not arrestin domain-containing proteins play a role in *Dictyostelium discoideum* CAMP-mediated chemotaxis

architecture (i.e., methyl-accepting chemotaxis proteins (MCPs) in bacteria and G protein-coupled receptors (GPCRs) in eukaryotes). By understanding chemotaxis by analogy to communication theory, we hope to apply principles such as *message* size, complexity, and redundancy, as well as *transmitter* capacity and combinatorial complexity to extract fundamental principles and paradoxes of diverse chemotaxis systems.

### 2 | OVERVIEW OF THE MESSAGE AND TRANSMITTER

#### 2.1 | The input for chemotaxis

We begin by discussing general features of the input for chemotaxis, namely the chemoattractant and chemoattractant receptor systems. We draw upon Shannon's model of communication by considering both the *message* that is being conveyed and the *transmitter* that "operates on the message in some way to produce a signal suitable for transmission".<sup>34</sup> For our purposes, we designate the chemoattractant ligand as the *message* and the chemoattractant receptor as the *transmitter*, and the result of their interaction as the *input* (Fig. 1). The *transmitter* (chemoattractant receptor) can be said to "operate" on the *message* (chemoeffector ligand) to initiate complex signal transduction path-

ways (through the *noisy channel*) that ultimately lead to the output of chemotaxis. Here, we will compare and contrast the chemotactic *input* for prokaryotes (*E. coli*) and eukaryotes (*Dictyostelium discoideum* and mammalian neutrophils) in an attempt to derive general design principles for the architecture of effective chemotactic signal transmission.

## 2.2 | The chemotactic message and transmitter for prokaryotes

First, we consider the *message* driving prokaryotic chemotaxis. As the most extensively studied prokaryotic chemotaxis systems are bacterial, we restrict our considerations here to bacterial species (specifically, to *E. coli*), though the archaeal systems that have been studied are remarkably similar.<sup>35</sup> Bacteria are broadly capable of recognizing diverse chemoattractant and chemorepellant *messages* including amino acids, sugars, peptides, toxins, alcohols, and oxygen.<sup>23</sup> Bacterial chemotactic *messages* can also be grouped according to the "type" of message they represent, for instance nutrient (e.g., amino acids, sugars), environmental (e.g., pH, temperature), danger (e.g., phenol, lipids, other repellants), or communication (e.g., Al-2, which choreographs quorum sensing behaviors)<sup>36,37</sup> (Fig. 2A). Finally, bacterial chemotactic *messages* can also be grouped according to the receptor-activation mechanism. Some chemotactic ligands freely diffuse into the periplasmic ligand binding domain (LBD) of the chemoreceptor, whereas

others (e.g., dipeptides, sugars, AI-2) bind first to a periplasmic binding protein (BP), and the ligand-BP complex then binds and activates the receptors. $^{38-41}$ 

Next, we consider the transmitter that interprets the messages encoded in bacterial chemoeffectors to modulate chemotaxis. Bacteria possess highly conserved machinery for recognizing and responding to environmental chemoeffectors.<sup>42</sup> This machinery includes plasma membrane-spanning chemoreceptors, known as MCP receptors, and a cohort of cytosolic kinases and adaptor proteins that relay MCP chemoattractant recognition signals to the flagellar motor complex to alter chemotactic direction (Fig. 2A). An MCP receptor core-signaling unit is composed of a trimer of dimers, and the LBD is commonly located at the periplasmic dimer interface. Ligand binding induces conformational and/or dynamic changes that are transmitted through the plasma membrane to a cytosolic "signal conversion module" known as a HAMP domain, which in turn transmits these changes to the signaling domain (SD), the most conserved domain of MCP receptors.<sup>36,43</sup> These changes in the SD inhibit autophosphorylation of the histidine kinase CheA through a cytosolic adaptor, CheW. Decreased CheA phosphorylation results in decreased phosphorylation of the cytosolic effector CheY, which directly regulates the flagellar motor complex to direct chemotaxis. The MCP receptor core-signaling unit complexes with CheA and CheW to form supramolecular hexagonal arrays (chemosensory arrays) consisting of thousands of proteins, and these chemosensory arrays allow for significant amplification (at least 50fold) of the chemoeffector stimulus.<sup>44-48</sup> While the MCP architecture described is the best studied and most common architecture, MCP receptors can adopt alternative architectures, although all contain the conserved SD.43

The model system *E. coli* encodes five MCP receptors, each of which recognizes on the order of 1–2 ligands: Tsr (taxis to serine and repellants), Tar (taxis to aspartate and repellants), Tap (taxis to dipeptides), Trg (taxis to ribose and galactose), and Aer (taxis to oxygen).<sup>36</sup> The amino acid-binding MCP receptors (Tsr and Tar) are approximately 10-fold more abundant than the low-abundance dipeptide and sugar-biding MCP receptors (Tap and Trg).<sup>49</sup> Aer is an unorthodox MCP receptor<sup>50</sup> due to the presence of a cytoplasmic N-terminal Per-Arnt-Sim (PAS) sensing domain rather than a periplasmic LBD.<sup>36</sup> Regardless, all five *E. coli* MCP receptors share identical trimer contact residues,<sup>22</sup> which enable participation in mixed trimers of dimers or "receptor squads" and allow for complex, amplified signaling.<sup>51</sup>

#### 2.3 | The chemotactic message for eukaryotes

For *D. discoideum*, the chemoattractant *message* is well described for each stage of its life cycle,<sup>52</sup> and is limited to a few players. During its vegetative growth stage, *D. discoideum* cells migrate toward food sources by responding selectively to folate.<sup>52,53</sup> Upon starvation, *D. discoideum* cells aggregate to form a multicellular structure by selectively responding to cAMP secreted by other *D. discoideum* cells.<sup>54,55</sup> In contrast, the chemoattractant *message* for mammalian neutrophils (and even more broadly, for leukocytes) is considerably more complex. Neutrophils respond to a wide variety of chemoattractants including lipids (e.g., leukotriene B4 (LTB4),<sup>56</sup> platelet-activating factor (PAF)<sup>57</sup>), peptides (e.g., fMLP,<sup>58</sup> LL-37<sup>59</sup>), protein fragments (e.g., C5a<sup>60</sup>), and proteins (e.g., chemokines<sup>61–63</sup>), each of which orchestrates a unique migration response critical for efficient neutrophil function.<sup>61</sup> Similar to their prokaryotic counterparts, eukaryotic chemoattractant messages can be grouped according to the "type" of message they represent, whether nutrient (e.g., folate), "danger" (e.g., fMLP, LL-37, LTB4, PAF, C5a), or communication (e.g., cAMP, chemokines) (Fig. 2B). Alternatively, eukaryotic chemoattractant *messages* can be grouped according to size (Fig. 3), whether small molecule (e.g., folate, cAMP), lipid (e.g., LTB4, PAF), peptide (e.g., formylated peptides), or protein (e.g., chemokines, complement products).

Eukaryotic chemoattractant messages are primarily transmitted through members of the GPCR superfamily. GPCRs share a common seven transmembrane (7TM) helical architecture with an extracellular N-terminus, alternating intracellular and extracellular loops, and an intracellular C-terminus.<sup>64,65</sup> Agonist binding to GPCRs leads to structural and dynamic changes that are transmitted to the intracellular side of the receptor, classically resulting in the activation of heterotrimeric G proteins.<sup>64,65</sup> Heterotrimeric G proteins consist of 3 subunits,  $G\alpha$ ,  $G\beta$ , and  $G\gamma$ . Upon activation, the  $G\alpha$  subunit exchanges GDP for GTP and the heterotrimer dissociates into 2 functional units,  $G\alpha$ -GTP and  $G\beta\gamma$ , which then activate a number of distinct downstream signaling pathways.<sup>66,67</sup> In humans, there are 16 genes that express 21 G $\alpha$  subunits of 4 main classes (G $\alpha$ i/o, G $\alpha$ s, G $\alpha$ g/11, and G $\alpha$ 12/13), grouped according to sequence similarity and the downstream signaling pathways they trigger.<sup>67</sup> GPCRs are known to exhibit specificity for one or more  $G\alpha$  classes,<sup>68,69</sup> and while mammalian chemoattractant responses are largely mediated through  $G_{\alpha i}/o$ , most chemoattractant GPCRs also act through  $G_{\alpha}\alpha/11$  and  $G_{\alpha}12/13^{70}$  (see Fig. 3C). In contrast, Dictyostelium discoideum cells express 14 distinct Gα subunits, all of which share 40-50% identity and are most similar to the mammalian Gai/o class.<sup>19,53,71</sup> D. discoideum chemoattractant GPCRs are associated with 2 specific  $G\alpha$  subunits,  $G\alpha$ 2 (for cAMP-mediated chemotaxis) and  $G\alpha 4$  (for folate-mediated chemotaxis) (Fig. 3B).<sup>53</sup> Compared to the G $\alpha$  subunit, the G $\beta\gamma$  subunit shows less genetic diversity, with 5  $G\beta$  and 12  $G\gamma$  subunit genes in humans and only a single  $G\beta$  and  $G\gamma$ subunit gene in D. discoideum.<sup>19,67</sup> Though it was classically thought that chemotactic responses were mediated through the  $G\beta\gamma$  functional unit (with the  $G\alpha$  acting as a "timer", controlling the release and consequent activation of  $G\beta\gamma$ ), both  $G\alpha$ -GTP and  $G\beta\gamma$  have been shown to play important roles in directing eukaryotic chemotaxis, each triggering unique signaling cascades that are necessary for both the establishment of cellular polarity and migration.72-76

Following activation, GPCRs are phosphorylated at their intracellular loops and C-terminal tail by GPCR kinases (GRKs), facilitating interactions with  $\beta$ -arrestins.<sup>77</sup>  $\beta$ -arrestins have important roles in receptor desensitization and internalization, but also act as G proteinindependent signal transducers for GPCRs.<sup>77</sup> In the context of mammalian cell chemotaxis,  $\beta$ -arrestins not only modulate receptor G protein signaling and surface expression, but to also contribute to the spatial regulation of actin assembly proteins.<sup>78</sup> Mammals express 2 nonvisual arrestins ( $\beta$ -arrestin1 and  $\beta$ -arrestin2), both of which play important roles in mammalian cell chemotaxis.<sup>78-80</sup>  $\beta$ -arrestin1 and



**FIGURE 3** Comparison of communication circuitry among different organisms by message complexity. Chemotactic messages of different chemical complexity (i.e., small molecule, lipid, peptide, and protein) have different repertoire sizes (i.e., the number of ligands) and utilize unique circuitry to transmit their message. (A) *Escherichia coli* is used as an example to show the message, transmitter, and noisy channel architecture of each circuit. Messages (i.e., ligands) are shown as blue boxes. The transmitters (i.e., MCP receptors, Che proteins) are shown as gray boxes. Messages are connected to their corresponding transmitters via solid black lines, with uncertain or debated connections shown in gray. (B) *Dictyostelium discoideum* utilizes soley small molecule chemoattractant ligands, while (C) mammalian neutrophils utilize lipid, peptide, and protein messages. The G protein specificity of each message-transmitter system is shown. Regardless of the specific message chemical complexity and receptor subtype, all systems seem to require Gai/o for chemotactic signaling, though most also signal through other G protein subtypes (specifically, through the Gaq/11 family). The role of  $\beta$ -arrestins in chemotactic signaling for many systems is still being elucidated (shown as gray arrows), but  $\beta$ -arrestin 1 and  $\beta$ -arrestin 2 have been shown to be required for chemokine-mediated chemotactic signaling

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 $\beta$ -arrestin2 are required for chemotaxis in some mammalian cell systems, though their precise role is undefined in many contexts.<sup>78</sup> In contrast, *D. discoideum* is not known to have true arrestins, but rather contains six distinct arrestin-domain containing proteins (AdcA, AdcB, AdcC, AdcD, AdcE, AdcF).<sup>81,82</sup> Two of these arrestin-domain containing proteins (AdcB and AdcC) may play a role in cAMP signaling in *D. discoideum*, but their role in mediating chemotaxis is still unclear (Fig. 2B).<sup>81,83</sup>

## 2.4 | Transmitting unique chemotactic messages in eukaryotes

To address *message* (i.e., chemoattractant) diversity present in eukaryotic systems, we will now consider the chemoattractant messages for eukaryotic chemotaxis systems in more detail. We will consider these messages according to their relative size and chemical complexity (small molecule, lipid, peptide, protein fragment, and protein), and explore their interactions with their respective *transmitters* (i.e., GPCRs, heterotrimeric G proteins, and  $\beta$ -arrestins) (Fig. 3).

#### 2.4.1 Small molecule chemoattractants

While prokaryotic chemotactic messages are nearly exclusively small molecules (See Section 2.2, Fig. 3A), eukaryotic chemotactic responses to small molecule messages are largely limited to the soil-dwelling amoeba D. discoideum (Fig. 3B). As noted above, D. discoideum cells primarily respond to two distinct small molecule chemoattractants, folate and cAMP, and modulate their responsiveness to each molecule with respect to their current life cycle stage.<sup>84</sup> Four cAMP receptors have been identified in D. discoideum (cAR1, cAR2, cAR3, and cAR4), each with unique expression patterns and affinities for cAMP.85 D. discoideum cARs signal through Ga2-associated heterotrimeric G proteins,<sup>85,86</sup> and may interact with arrestin-domain containing proteins to modulate cAMP responses.<sup>83</sup> To date, only 2 folate receptors have been identified in D. discoideum (fAR1 and fAR2), and only fAR1 has been shown to be required for folate-induced signaling.<sup>87</sup> Further, recent evidence suggests that the folate receptor fAR1 couples to  $G\alpha 4$ associated heterotrimeric G proteins, rather than  $G\alpha 2.^{87}$ 

#### 2.4.2 | Lipid chemoattractants

Eukaryotic chemotactic responses to lipids (e.g., LTB4, PAF) are typically associated with neutrophils (and other mammalian leukocytes) rather than with *D. discoideum* (Fig. 3C), though there are some reports of *D. discoideum* responding chemotactically to LPA.<sup>86,88</sup> Leukotriene B4 (LTB4) is an arachidonic acid derivative produced in response to inflammation, and is a potent chemoattractant for neutrophils (as well as for other leukocytes including eosinophils, monocytes, and T cells).<sup>89,90</sup> LTB4 binds 2 highly homologous (45.2% sequence identity) G protein-coupled receptors, BLT1 and BLT2.<sup>90,91</sup> BLT1, expressed primarily on leukocytes, binds LTB4 with higher affinity than BLT2, which is expressed ubiquitously.<sup>91</sup> BLT1 and BLT2 are promiscuous in their affinities for different heterotrimeric G proteins, signaling through members of both the Gai/o and Gaq/11 classes, though both require Gai signaling to mediate chemotactic responses.<sup>91</sup> Platelet activating factor (1-O-alkyl-2-acetyl-sn-glyceryl-3-phosphorylcholine; PAF),<sup>92</sup> is a general term for a group of phospholipid molecules whose chemical identity is dependent on both the cell type and the stimulus that lead to its production.<sup>57,93</sup> PAF mediates chemotaxis by interacting with a single GPCR, platelet-activating factor receptor (PAFR).<sup>94</sup> PAFR signals through both pertussis toxin (PTX)-sensitive Gai/o and PTX-insensitive Gaq/11 heterotrimeric G protein classes,<sup>95,96</sup> though, similar to BLT1 and BLT2, PAFR-driven chemotactic events are mediated exclusively through Gai/o signaling.<sup>97</sup>

#### 2.4.3 | Peptide chemoattractants

Forymylated peptides are produced and secreted by bacteria, which initiate protein synthesis with a formylated methionine. These peptides act as pathogen-associated molecular patterns (PAMPs), alerting the immune system to bacterial pathogens by triggering chemotaxis of neutrophils and other immune cells following peptide interactions with formyl peptide receptors 1-3 (FPRs 1-3) (Fig. 3C).<sup>98</sup> FPR1 and FPR2 respond to formylated peptides of different lengths, with FPR1 preferring shorter peptides and FPR2 preferring longer peptides.<sup>98,99</sup> FPR3 shares ligands with FPR2, but binds fewer peptides than FPR1 and FPR2, and all 3 receptors are associated with chemotactic responses of mammalian immune cells.<sup>99</sup> FPRs 1 and 2 are unusually promiscuous, jointly estimated to recognize over 100,000 different formylated peptides, which, if true, would constitute the largest ligand sets of any GPCRs.<sup>100</sup> Like other mammalian chemoattractant receptors, FPRs primarily couple to  $G_{\alpha i}/o$  proteins, but coupling to other G proteins has been reported.<sup>101</sup>

#### 2.4.4 | Protein chemoattractants

With approximately 45 chemokine ligands and 20 receptors, the chemokine-receptor system represents the most extensive system of ligands and receptors for mediating chemotaxis (Fig. 3C). Chemokine ligands can be subdivided structurally, by the arrangement of a conserved set of cysteines (i.e., CC, CXC, CX3C, and XC) or by their functional role (e.g., inflammatory versus homeostatic).<sup>102</sup> Receptors are subdivided based upon the type of ligand they bind (i.e., CC receptors, CCRs, or CXC receptors, or CXCRs). While there are no apparent structural features distinguishing CCRs and CXCRs, instances in which CC chemokines bind CXC receptors and vice versa are rare.<sup>103</sup> Members of a third class of chemokine receptors known as atypical chemokine receptors (ACKRs) do not couple to G proteins (although G protein coupling has been reported to the atypical receptor CCRL1<sup>104</sup>) and are incapable of eliciting chemotaxis. Instead, ACKRs modulate extracellular chemokine gradients by internalizing chemokine ligands and targeting them for degradation.  $^{\rm 104,105}$  Despite widespread promiscuity, some chemokines and receptors are monogamous, binding only one respective partner.<sup>106</sup> Receptor promiscuity is regulated at the systems level by the selective expression of different chemokine receptors on different cell types, and the selective expression of chemokines in different physiologic and anatomical contexts. Broadly speaking, chemokine receptor subsets are expressed on all major immune cells.<sup>107</sup> Like other chemoattractant GPCRs, chemokine

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receptors primarily couple to  $G\alpha i/o$  proteins, but have been reported to couple to  $G\alpha s,$   $G\alpha q/11,$  and  $G\alpha 12/13.^{108}$ 

Other protein chemoattractants include cleavage products of the complement system. The complement system consists of a set of cytosolic proteins that are activated in innate immune responses to trigger killing, phagocytosis, and clearance of pathogens and infected cells, as well as recruit immune cells to sites of infection.<sup>109,110</sup>The principle complement pathways (i.e., classical, alternative, and lectin pathways) are activated by different stimuli to initiate generation of a set of secreted protein fragments. These fragments, in turn, can assemble a lethal pore complex in the pathogen's membrane (i.e., membrane attack complex, MAC), signal to immune cells, or opsonize pathogens for subsequent phagocytosis.<sup>109</sup> Two of these secreted complement protein fragments, C3a (~9 kDa) and C5a (~11 kDa), interact with cell surface GPCRs to trigger chemotaxis<sup>111,112</sup> (Fig. 3C). C5a binds 2 complement receptors, C5aR and C5L2 which are typically coexpressed with one another on immune and nonimmune cells.<sup>112,113</sup> Whereas C5aR activation results in the activation of G proteins and  $\beta$ -arrestins, C5L2 activation does not activate G protein, functioning exclusively through  $\beta$ -arrestin pathways, analogously to ACKRs.<sup>113,114</sup> Like other eukaryotic chemoattractant receptors, C5aR signals through both the PTX-sensitive  $G\alpha i/o$  and the PTX-insensitive  $G\alpha g/11$  heterotrimeric G protein classes.<sup>95,115</sup> C3a binds C3aR on the surface of many immune and nonimmune cells, and stimulates chemotaxis in both a direct and indirect fashion.<sup>116-119</sup> Though C3aR has also been shown to signal through  $G_{\alpha i}/o$ ,  $G_{\alpha g}/11$ , and potentially  $G_{\alpha 12}/13$  heterotrimeric G protein classes, its intracellular signaling pathways are cell type-specific and distinct from those stimulated by C5aR.<sup>120-122</sup>

### 3 | HOW MUCH INFORMATION?

## 3.1 | The *information* in chemotactic communication systems

In communication theory, *information* is the "measure of one's freedom of choice when one selects a message".<sup>34</sup> For example, each character in the Latin alphabet (26 characters) possesses much more information than each character of Morse code (3 characters: dot, dash, and space), because one has significantly more choice in how to express oneself when choosing from the larger set of Latin characters.<sup>123</sup> Indeed, it takes a sequence of dots and dashes to specify a single letter of the alphabet, and thus more dots and dashes than letters to specify the same word, showing how symbols vary in the amount of information they encode.

Like Morse code and the Latin alphabet, chemoattractant ligands encode different amounts of information to coordinate chemotaxis in bacteria, *D. discoideum*, and immune cells. In this section, we ask the following questions: How diverse are the sets of chemoattractant *symbols* used by these systems, and how might that change the amount of *information* each system is able to convey in the context of chemotaxis? How diverse are the sets of cell-surface receptors that receive and *transmit* the messages encoded in chemoattractants, and how might their diversity and type alter ability to transmit the full meaning of the encoded messages to the inside of the cell? How are the chemoattractant alphabets used by these systems strung together into sentences that convey more complex instructions? Finally, why do bacteria, *D. discoideum*, and immune cells use such different alphabets to accomplish the same task?

In this section, we address these questions with the help of 4 principles: (1) message alphabet size, (2) message complexity, (3) transmitter capacity, and (4) combinatorial complexity (Fig. 4). These principles will help inform the way we understand how different organisms encode information to direct complex chemotactic processes. In each subsection, we will highlight illustrative examples of how these principles shed light on cellular chemotaxis in different systems.

# 3.2 | Understanding chemotactic information by message alphabet size

The idea of information as a function of 'message alphabet size' was developed by Ralph Hartley. Hartley developed an equation that defines the amount of information in a message as the base 2 logarithm of the number of symbols from which it was selected (i.e., the alphabet size).<sup>34,124</sup> For instance, a symbol chosen at random from a set of 32 symbols carries 5 bits of information per symbol (number of possible symbols =  $2^{\text{amount of information per symbol}}$ , or  $32 = 2^5$ ). With this equation, we see that larger alphabets contain more information per symbol (Fig. 4A). If we compare chemoattractant message alphabet sizes of E. coli, D. discoideum, and neutrophils, we find widespread variation in the information content among chemoattractant ligands or messages. For E. coli, whose alphabet contains ~10 messages (see Section 2.2), each individual message is estimated to contain only  $\sim$ 3 bits of information per ligand. Similarly, the 2 chemoattractant messages for D. discoideum (i.e., cAMP and folate) each carry only 1 bit of information. The chemoattractant message alphabet for neutrophils is by far the largest, with more than 100,000 estimated messages.<sup>100</sup> Each neutrophil chemoattractant message thus contains ~17 bits of information, significantly more information than either E. coli or D. discoideum chemoattractant messages.

Chemoattractant message alphabet size can be defined in two other ways, the number of ligands belonging to a particular class (e.g., chemokines vs. formylated peptides, see Fig. 3) or the number of ligands binding a single chemoattractant receptor. Considering these definitions of message alphabet size, we find that *E. coli* and *D. discoideum* possess restrictive alphabets by all definitions. For example, *E. coli* MCP receptors recognize exclusively small molecule chemoeffectors and each MCP receptor typically interacts with only 1–2 ligands (though some MCP receptors have been reported to bind upward of 5).<sup>36</sup> *D. discoideum* principally respond to a single nutrient (i.e., folate) and a single communication signal (i.e., cAMP), both of which are small molecule chemoeffectors. The alphabet size of ligands shared by a single receptor is similarly limited, with cAMP and folate constituting the only canonical ligands binding the respective receptors.<sup>52</sup>

Comparatively, mammalian neutrophils encode significantly larger chemoattractant alphabets. Formylated peptides, which act as bacterial pathogen signals, and chemokines, which act as intercellular communication signals, have alphabet sizes of  $>100,000^{100}$  and  $\sim$ 45





**FIGURE 4** Four principles to decode the chemotactic signal. Comparisons of chemoattractant-receptor systems used by *E. coli*, *D. discoideum*, and neutrophils by message alphabet size (A), message complexity (B), transmitter capacity (C), and combinatorial complexity (D) demonstrate that chemoattractant receptor systems differentially encode complex chemotactic outcomes

ligands,<sup>103</sup> respectively. In addition to these two large alphabets, mammalian neutrophils respond to two small alphabets: LTB4 and PAF, which encode general-use inflammation signals, and complement pathway products (e.g., C5a), which encode pathogen danger signals.<sup>90</sup> Considering the Hartley principle as above, in which symbols in large alphabets encode more information than those in small alphabets, formylated peptides are the most "information-rich" chemoattractant class for neutrophils, followed by chemokines, then LTB4, PAF, and complement, which are on par with *E. coli* and *D. discoideum* chemoattractant systems. This theoretical information hierarchy agrees with what is known biologically, as diverse bacterial pathogens encode highly specific, "information-rich" chemical signals as compared to broad-utility chemoattractant cues like leukotrienes and complement products. Chemokines, which have an intermediate information capacity according to Hartley's principle, are used broadly as a family, although individual ligand-receptor systems can be employed in highly specific contexts.

Using communication theory to compare chemoattractant systems among *E. coli, D. discoideum*, and neutrophils highlights the following question: Why do neutrophils need larger, more diverse alphabets than their eukaryotic *D. discoideum* counterparts, despite sharing much of the same receptor and intracellular machinery? The answer to this question may be understood by comparing the *context-specificity* afforded by small versus large chemoattractant alphabets.



Large chemoattractant alphabets allow neutrophils to undergo chemotaxis to serve functionally diverse roles as a major arm of the innate immune system, whereas *D. discoideum* undergo chemotaxis in only two contexts. Thus, while both organisms utilize similar machinery, differences in message alphabet size between neutrophils and *D. discoideum* emphasize the difference in complexity between the two eukaryotic organisms, illustrating the need for a more complete understanding of organism- or cell type-specific (e.g., mammalian rather than broadly eukaryotic, neutrophil rather than macrophage) chemotaxis.

## 3.3 Understanding chemotactic information by message complexity

The amount of information encoded in a chemoattractant ligand can also be evaluated in terms of chemical complexity. To demonstrate this principle, we borrow a concept developed by Hann and colleagues, in which ligands and receptors are depicted by strings of "+" and "-" signs (e.g., receptor: - + - + - - + -; ligand: + + -) (Fig. 4B).<sup>125</sup> In this model, binding events only occur when ligand and receptor contain strings of complementary signs, which represent the combination of interactions (e.g., shape, electrostatics, van der Waals, H bonding, etc.) that create binding specificity. Intuitively, the larger the ligand, the more requirements there are for it to make complementary interactions across a more distributed receptor surface. While the authors use this analysis to derive strategies for optimizing drug discovery efforts, it is useful to consider the effect of increasing ligand complexity in instances where nature has already provided specific ligand-receptor pairs.

The chemical complexity of chemoattractant messages for the mammalian immune system vary drastically by both composition (small molecules, modified peptides, lipids, and proteins) and size (~330 Da for cAMP vs. 9,000-12,000 Da for chemokines). Comparatively, the composition and size of bacterial chemoattractant (or chemorepellant) ligands is more limited, with the best studied bacterial ligands (e.g., serine, aspartate, dipeptides,  $O_2$ ) < 500 Da (although it should be noted that some chemoattractants bind periplasmic binding proteins which then bind MCP receptors, see section 2.2). Though D. discoideum is a eukaryotic system, the canonical D. discoideum chemoattractants are much closer in size to prokaryotic (i.e., E. coli) chemoattractants than to those of mammalian neutrophils, with cAMP at ~330 Da and folate at ~440 Da. Thus, based on chemical complexity, mammalian neutrophil chemoattractants have the potential to encode much more information and conceivably more complex outcomes than either E.coli or D. discoideum. In effect, whereas E.coli and D. discoideum ligands would be represented by short strings of +'s and -'s, neutrophil ligands would be represented, on average, by much longer strings of +'s and -'s.

What are the functional implications of utilizing "information-rich," complex ligands to organize chemotaxis? The comparatively complex structure of chemokines, for one, allow many of them to encode signaling specificity (i.e., biased signaling) at a given receptor, demonstrating how a more chemically complex message enables complex cellular outcomes.<sup>106</sup> Interestingly, despite their structural complexity, chemokines possess a highly conserved tertiary structure, which constrains their chemical diversity to some extent. Moreover, the high degree of chemokine structural similarity suggests that among chemokines, complexity is encoded by substituting residue identities on a structurally conserved scaffold. It should be mentioned that beyond receptor-interactions, the ligand complexity of chemokines allows them to encode numerous other functions, some of which are associated with chemotaxis, like GAG binding and homo-/hetero-dimerization, as well as non-chemotactic functions, such as antimicrobial activity.<sup>126-128</sup>

Formylated peptides, which have lengths between 3 and 10 amino acids on average, demonstrate much less individual complexity than chemokines, but with >100,000 approximated members, they have the potential to encode significantly more information by way of combinatorial complexity.<sup>100</sup> Nevertheless, molecular modeling studies suggest that formylated peptides, like chemokines, share a conserved structure, despite divergent amino acid sequences. Bufe and colleagues demonstrated the formation of a common "clawlike" fold, stabilized by residues at only 3 peptide positions, which allows for considerable sequence diversity at other peptide residues.<sup>100</sup> Interestingly, substitution of peptide residues outside of 3 conserved positions had little effect on chemotaxis.<sup>100</sup> In the context of the Hann model. formylated peptide structural conservation and sequence constraints may functionally limit their complexity such that instead of being represented by >100,000 unique strings of +/- symbols, apparently different formylated peptides may in fact be redundant, such that a common string of +/- symbols may more appropriately represent their chemical complexity.

The chemical complexity framework highlights the following paradox: how do small, low-complexity chemoattractants, such as LTB4 maintain receptor specificity, while larger, high-complexity ligands, such as chemokines, demonstrate widespread promiscuity? Regarding the chemokine system, we speculate that chemokines sharing common receptors are more evolutionarily related to one another than those binding different receptors. Consequently, even though all chemokines would be represented by long strings of +/- symbols that should, in principle, be highly specific for an individual receptor, chemokines sharing a common receptor would have closely related +/- strings. While numerous structural studies of unique chemokinereceptor interactions have highlighted how chemokines recognize their receptors for specific ligand-receptor pairs, structures of different chemokines bound to the same receptor (and vice versa) and new bioinformatics approaches will be needed to understand how chemokines are able to be so promiscuous despite highly complex interactions with their receptor counterparts.

# 3.4 | Understanding chemotactic information by transmitter capacity

In our discussion of information content of chemotactic systems, we must also consider how the chemoattractant message is *encoded* by the *transmitter* (i.e., receptor) (Fig. 4C). Transmitters may vary (1) in the ways in which they encode different messages, and (2) the extent to which they can encode the full complexity of the message. In other words, while complex (i.e., "information-rich") ligands can, in principle, relay more information to the cytosol than can simple



ligands (i.e., "information poor"), ligand complexity may be lost when the signal is passed through the receptor such that the output signal contains less information than the original ligand message. Thus, while message alphabet size and message complexity are significant when considering the information content of chemotactic systems, the *transmitter* of the chemotactic message (i.e., the chemoattractant receptor) plays a significant role as well. In this section, we summarize this significance using the concept of "transmitter capacity."

Shannon discusses encoding as a process of "operating on a message" to change its format in a way that is "suitable for transmission over the channel," for instance encoding words into Morse code or encoding speech into a digital signal to send over a telephone wire.<sup>34</sup> In chemotactic signal transduction, the receptor (e.g., MCP receptor or GPCR) encodes the message of the chemoattractant by undergoing conformational and dynamic changes in the ligand-bound state, and these changes are interpreted by cytosolic signaling molecules (e.g., CheA/W proteins in bacteria or G proteins/ $\beta$ -arrestins in eukaryotes) which relay the converted message to the interior of the cell. Transmitter capacity, or the ability of chemoattractant receptors to adequately decode the complexity of chemoattractant messages for transmission to the intracellular environment, is functionally constrained (1) at the structural level, in the extent to which a given receptor can interpret the differences of its numerous chemoattractant binding partners (i.e., receptor promiscuity), and (2) at the signaling level, in the extent to which the same receptor can initiate complex outcomes through any number of cytosolic effectors (i.e., biased signaling).

Considering first transmitter capacity at the structural level, bacteria and eukaryotes have evolved vastly different receptor systems to transmit information encoded in chemoattractant ligands to cytosolic effectors that can regulate chemotaxis. Comparing the structures used by prokaryotic and eukaryotic chemoattractant receptors, the E. coli MCP receptors are >3000 kDa (i.e., as trimer-of-dimers) and span  $\sim$ 350 Å, whereas GPCRs are typically 40–50 kDa and span  $\sim$ 50 Å.  $^{129,130}$  It is interesting to consider the size discrepancy of the two systems, relative to the sizes of their respective ligands. MCP receptors are on the order of 10<sup>4</sup> times larger than their ligands by mass, whereas GPCRs range from ~1-10 times the mass of their ligands. Despite this size difference, receptor promiscuity, or the ability of a chemoattractant receptor to respond to more than one chemoattractant ligand, is common to both bacterial MCP receptors and eukaryotic GPCRs. However, the number of chemoattractant messages that a single receptor can transmit (i.e., the degree of receptor promiscuity) differs for each organism. The  $\sim$ 10 chemotactic messages for E. coli are transmitted through only 5 MCP receptors, with each MCP receptor transmitting 1-2 messages (or 10-20% of the total), on average. In contrast, the 6 chemoattractant GPCRs (4 cAMP, 2 folate) for D. discoideum transmit only 2 chemotactic messages, with a given GPCR only transmitting 1 of the 2 messages (or 50% of the total). Mammalian neutrophils are considerably more complex than either E. coli or D. discoideum, with ~30 chemoattractant GPCRs to interact with >100,000 potential messages (see Section 3.2). For mammalian neutrophils, however, it is perhaps more valuable to consider the transmitter fidelity for each chemoattractant class (e.g., chemokines vs formylated peptides) rather than the group together. For example, we say that mammalian neutrophils have >100,000 potential chemoattractant messages, but most of these are of the formylated peptide class which are transmitted through only 2 (or possibly 3) receptors (Fig. 3).

Further, the activation mechanisms of GPCRs and MCP receptors share both "piston" type movements (e.g., at TM2 in MCP receptors and at TM5 in GPCRs) as well as large scale dynamic alterations, although the structural differences between the two receptors make the dynamic changes very different.<sup>129,131,132</sup> In both cases, long clusters of alpha helices allow the receptor systems to amplify the small changes occurring at the ligand binding pocket into much larger changes intracellularly, although despite their increased length, conformational changes in MCP receptors are subtle and localized to the distal CheA and CheW contact sites.<sup>133</sup> Despite their distinctive size advantage, bacterial MCP receptors are much more limited than D. discoideum or mammalian neutrophil GPCRs in the amount of information they can transmit to the cytosol, and eventually, to the chemotaxis machinery. As discussed above, bacterial MCP receptors alter chemotaxis by modulating the rate of autophosphorlation of the cytosolic effector CheA, which directly interacts with the flagellar motor complex. While the rate of CheA autophosphorylation can be modulated by additional proteins (e.g., methyltransferase CheR and methylesterase CheB), the information encoded in individual chemoattractant ligands is limited to altering the function of a single effector in CheA.

Contrastingly, GPCRs are capable of eliciting activation of numerous cytosolic effectors, including but not limited to G proteins, G protein-coupled receptor kinases (GRKs), and  $\beta$ -arrestins. Moreover, GPCRs exhibit widespread biased signaling, in which different ligands preferentially activate a subset of the available effectors to elicit ligand-specific outcomes.<sup>134</sup> Biased signaling is widespread in the chemokine system, with different chemokine ligands eliciting unique signaling profiles at the same receptor.<sup>106</sup> While much less established, biased signaling may also play a role in the formylated peptide receptor system.<sup>98,99,135-137</sup> Although biased signaling has not been explicitly described in D. discoideum, D. discoideum nevertheless has numerous cytosolic effectors available to initiate complex signaling outcomes that are adaptable in different environmental circumstances.<sup>138</sup> In effect, eukaryotic chemoattractant receptor systems are better equipped to initiate diverse outcomes. In other words, the large, diverse, and complex chemoattractant messages used by eukaryotes are in many cases transformed into complex downstream outcomes. Comparatively, the diverse E. coli chemoattrantant messages are funneled into activation of a single cytosolic effector, thus limiting the extent to which diverse messages can encode diverse processes.

A close inspection of GPCR-chemoattractant interactions sheds some light on the ways in which eukaryotic signals are capable of eliciting such complex intracellular pathways. Recent structural studies of chemokine-receptor interactions demonstrate an enormous ligandreceptor interface, spanning as much as  $1700 \text{ Å}^2$ .<sup>139</sup> Importantly, other recent studies suggest that differences in chemokine-receptor interactions far from the traditional receptor binding pocket influence how a single receptor can mediate alternative functional responses.<sup>140,141</sup> In one example, CXCL12 provokes and arrests chemotaxis in a monomeric and dimeric form, respectively, and structures of CXCL12 bound to its receptor CXCR4 in both forms demonstrate mutually exclusive interactions that may influence CXCL12's opposing effects on chemotaxis.<sup>141</sup> Comparison of three chemokine-receptor crystal structures demonstrates diverse binding orientations, suggesting that in addition to making unique ligand-receptor contacts, ligand orientation may also contribute to signal transmission.<sup>139,142,143</sup> These and other examples demonstrate the ways in which eukaryotic chemoattractant receptors, which transmit messages encoded in generally large and diverse chemoattractants, are high "capacity" transmitters insofar as they convey the full extent of the encoded messages by activating diverse functional responses.

## 3.5 Understanding chemotactic information by combinatorial complexity

Bacterial and eukaryotic cells navigate through complex environments in which they integrate multiple chemoattractant messages to devise a resultant chemotactic route. In an analogous way, Shannon demonstrates how one can construct complex sentences resembling English by semi-randomly choosing letters from the alphabet with the help of transition probability tables, which define the frequency at which each letter follows all other letters.<sup>34</sup> In both Shannon's stochastic English sentence algorithm and in chemotactic organisms, individual symbols or messages are "strung together" to create more complex outcomes. We will discuss this principle in the context of chemoattractant-receptor systems as "combinatorial complexity" (Fig. 4D).

Prokaryotes and eukaryotes are both capable of "stringing together" numerous chemoattractant messages to "build up" more complex chemotactic routes. In the case of prokaryotes, specifically E. coli, cocktails of environmental stimuli must be continually synthesized into a single, binary response (i.e., clockwise or counterclockwise rotation of flagella). As previously discussed (see Section 2.2), bacteria use the same machinery to sense and transmit diverse chemoeffector messages. Expansive chemoreceptor arrays, composed of mixed or uniform trimers of MCP receptor homodimers, work cooperativity to both amplify the chemotactic signal and to integrate diverse chemoattractant and chemorepellant messages.<sup>144-147</sup> Consequently, the net chemotactic response of a bacterium in a complex environment has been shown to be dependent on the relative abundance of the MCP receptor types,  $^{148}$  the sum of agonistic or antagonistic responses elicited by environmental stimuli at each MCP receptor,<sup>149,150</sup> as well as the methylation status or adaptation of each MCP receptor.<sup>32,151</sup> MCPs adapt to (or retain "memory" of) previous signaling events through the alteration of methylated glutamate residues by the methyltransferase CheR and the methylesterase CheB.<sup>151</sup> The slow methylation-demethylation adaptation process allows for the temporal gradient sensing necessary for both efficient bacterial chemotaxis and for maintaining MCP receptor sensitivity over a wide range of concentrations (from nanomolar to millimolar, in some cases).<sup>144,152</sup> Furthermore, although MCP receptors display cooperativity in the chemoreceptor arrays, methylation "memory" at MCP receptors is specific and thus allows for complex signal integration and signal prioritization.153



Eukaryotic cells similarly navigate through remarkably complex chemotactic environments. For example, mammalian neutrophils must navigate through the bloodstream, exit the vasculature via transendothelial migration, and subsequently migrate to the precise site of infection to perform their phagocytic function. In order to accomplish such a complex task, neutrophils (and other mammalian immune cells) utilize remarkably elegant systems to integrate and prioritize various chemotactic signals. As discussed in Section 3.2, eukaryotic immune cells recognize at least 4 different alphabets that evoke chemotaxis at different stages of an immune response (i.e., chemokines, complement fragments, formylated peptides, leukotrienes). Previous studies have demonstrated that neutrophils prioritize these different alphabets, utilizing "regulatory" (non-dominant) chemoattractants (i.e., chemokines and leukotrienes) to migrate to the vicinity of an infection and prioritizing "end target" (dominant) chemoattractants (i.e., at the site of the pathogen, complement fragments and formylated peptides) to home to the pathogen site, likely through a process of heterologous receptor desensitization.<sup>154,155</sup> Furthermore, studies have shown that neutrophils can integrate signals from competing non-dominant chemoattractants (e.g., the chemokine IL-8 and lipid LTB4) and migrate along their vector sum (e.g., between the 2 agonist sources).<sup>156</sup> Similar to bacteria, neutrophils navigate through complex chemotactic environments utilizing "memory" of their environment, though neutrophils do not encode their "memories" via methylation-demethylation adaptation but rather through a proposed mechanism of long-lived intracellular asymmetry of cytoskeletal elements.<sup>157</sup> To this end, a recent study by Prentice-Mott and colleagues demonstrated moesin, actomyosin, and microtubules to be among the key cytoskeletal elements mediating memory in neutrophil-like cells.<sup>157</sup>

### 4 | CONCLUSION

In utilizing an information theoretical framework to compare the chemotactic signal processing of prokaryotic and eukaryotic cells, the unifying significance of directed cellular movement can be readily appreciated. Though prokaryotes (i.e., *E. coli*) and eukaryotes (i.e., *D. discoideum* and mammalian neutrophils) use their respective chemotactic machinery to navigate through unique and diverse environments, common principles including message transmission, signal amplification and capacity, and memory are shared.

As discussed in this review, the chemotactic inputs for *E. coli* and *D. discoideum* are arguably simpler than that of mammalian neutrophils. Mammalian neutrophils (as well as other leukocytes) need to be able to migrate through considerably more complex environments than either *E. coli* or *D. discoideum* to mediate effective biologic responses. To do this, neutrophils utilize a large (>100,000 chemoattractants, see Section 3.2) and chemically diverse (i.e., lipids, peptides, and proteins, see Section 3.3) *message* alphabet. Fascinatingly, the entire alphabet for stimulating neutrophil chemotaxis (i.e., every chemoattractant ligand) is *encoded* or *transmitted* through the same receptor architecture (i.e., GPCRs, see Section 3.4), which is also shared with *D. discoideum*. Furthermore, the common *transmitter* 



architecture extends beyond the cell membrane, with nearly all chemotactic responses being at least partially mediated through  $G\alpha i/o$  or  $G\alpha i/o$ -like heterotrimeric G proteins (see Section 2.4). This remarkable "funneling" phenomenon allows mammalian neutrophils to chemotactically respond to an incredibly diverse repertoire of ligands, but complicates our understanding of how neutrophils are able to integrate a plethora of signals to orchestrate movement through complex environments (see Section 3.5). Moreover, as aberrant cell migration mediates a variety of pathologies, the common transmitter architecture is significant when considering therapeutic targeting of the chemotactic input. Indeed, GPCRs are among the most popular proteins for pharmacologic modulation, with ~40% of approved drugs targeting GPCRs.<sup>158</sup>

It is interesting to compare the inherent information capacity of prokaryotic and eukaryotic chemotactic outputs (i.e., chemotactic mechanism). The output of prokaryotic chemotactic systems (i.e., clockwise or counterclockwise flagellar rotation) can be thought of as a simple binary response corresponding to one bit of information,<sup>33</sup> while the output of eukaryotic chemotactic systems is considerably more complex. As eukaryotic cell migration requires the successful integration of a plethora of cellular events that are still being elucidated including directional sensing, establishment of cellular polarity, and movement by pseudopod extension,<sup>159</sup> the corresponding information capacity of eukaryotic chemotactic systems is considerably greater. Though here we focused primarily on the *input* of chemotactic systems (i.e., the chemoattractant and chemoattractant receptor), we refer an interested reader to a number of recent reviews detailing the current understanding of the complexities of the output of eukaryotic chemotactic systems.<sup>21,138</sup>

#### **AUTHORSHIP**

M. A. T. and A. B. K. contributed equally to this work.

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