

Trends

1. Microbes express many competitive phenotypes in the presence of others: exploitative phenotypes include metabolic changes that increase growth rates or secreting molecules to harvest nutrients, while interference competition occurs through antimicrobial secretions or contact-dependent killing.
2. Microbial competition is common, although evidence suggests that in many environments, inter-species interactions are weak.
3. Competition is expected on first encounter, but can be reduced over time through competitive exclusion, niche partitioning or spatial separation, leading to communities with a reduced local diversity of strains and species that can nevertheless coexist stably.
4. Many complementary methods exist to study microbial communities. Combining them to analyse a simple community would reveal a more complete picture.

The Ecology and Evolution of Microbial Competition

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Abstract

Microbes are typically surrounded by different strains and species with whom they compete for scarce nutrients and limited space. Given such challenging living conditions, microbes have evolved a plethora of phenotypes with which they can outcompete and displace their neighbours: secretions to harvest resources, loss of costly genes whose products can be obtained from others, stabbing and poisoning neighbouring cells, or colonising spaces while preventing others from doing so. These competitive phenotypes appear to be common, although evidence suggests that over time competition dies down locally, often leading to stable coexistence of genetically distinct lineages. Nevertheless, the selective forces acting on competition and the resulting evolutionary fates of the different players depend on ecological conditions in a way that is not yet well understood. Here, we highlight the remaining open questions and the theoretical predictions of the long-term dynamics of competition that remain to be tested. Establishing a clearer understanding of microbial competition will allow us to better predict their behaviour, and to control and manipulate microbial communities for industrial, environmental and medical purposes.

Keywords: interference competition, exploitative competition, bacteria, communities, social evolution.

The Nature of Microbial Competition

Microbes dominate the tree of life in species number and **diversity** (see Glossary), and inhabit the largest range of environments on earth. Like macroorganisms, microorganisms too live in a miniature entangled bank, where some species are tightly associated and rely heavily on each other to survive, such as the microbial guilds that convert nitrogen in the atmosphere to its various forms in the soil, or the symbiotic microbes that provide health benefits to their hosts. However, given the density in which microbes are found and the scarcity of resources in most environments, one cell's survival may mean starvation for another, leading to fierce **competition** for finite resources, be they sunlight, nutrients or space.

We consider phenotypes in a focal strain to be competitive if they cause a **fitness** decrease in a competitor strain, and if they are more likely to have evolved as a consequence of biotic competition rather than environmental pressures. Competitors must overlap in resource use, which excludes behaviours such as predation and parasitism that also reduce the fitness of one of the players. The competing strains that we refer to throughout the article can differ only by a single mutation or can be distantly related species.

The two main resources necessary for microbial survival are nutrients and space. Nutrients essential for growth and metabolic functions include: light, carbon, nitrogen, phosphorus,

sulphur, hydrogen, oxygen, calcium, iron and other metals [1-4]. Resource concentrations will vary between environments, such that microbes will be in competition for the limited components. As they grow and produce more biomass, microbial groups expand in space, and compete with others to colonise areas in which nutrients are abundant. A third and less commonly considered resource is genetic material. DNA is used as a nutrient source, but it may also provide its host with beneficial traits, enhancing its ability to survive and adapt [5]. The advantage of DNA uptake is particularly salient in the acquisition of antibiotic resistance genes [6, 7], but since there is also the possibility of taking up harmful genes, the net consequences of DNA uptake on microbial fitness remain unclear.

Competitive Phenotypes

There are two ways in which microbes compete for the resources listed above: (i) indirectly through exploitative competition, which occurs through resource consumption (passive competition) and (ii) directly through interference competition, where individual cells damage one another (active, chemical warfare).

Exploitative competition involves the consumption of a limiting resource by one strain restricting its supply from the competitor. This occurs either through increased nutrient uptake or through the extracellular secretion of molecules that harvest nutrients. As an example of the former, both *Saccharomyces cerevisiae* and *Escherichia coli* can metabolically shift from fermentation to respiration when oxygen is present, generating high growth rates but low yield, allowing them to absorb nutrients faster than their competitors [8-10]. Examples of the latter competitive strategy include the production of digestive enzymes to degrade complex nutrient molecules, or siderophores, which are iron-scavenging molecules that access insoluble iron. However, these molecules are often costly, and because they are secreted outside of the producing cell, they are also 'public goods' that benefit neighbouring cells. Therefore, another competitive mechanism is to exploit the products secreted by others, and lose or reduce a strain's own secretions, a strategy often referred to as 'cheating'. Of the best-studied systems involving the interplay between these two competitive mechanisms – cooperation that allows more access to nutrients, and cheating that saves the cost but relies on the presence of cooperators – is the production of iron-chelating siderophores [11-15] and of quorum sensing (QS) molecules that coordinate the expression and production of exofactors [16, 17].

Strains also compete to position themselves in prime locations within a niche while preventing others from accessing it [18]. This can be achieved either by rapidly colonising uninhabited spaces or by killing or pushing out already established competitors [19]. A variety of molecules are involved in these strategies: rhamnolipids allow cells to swim to new areas or push competitors away [20, 21]; adhesins bind to surfaces and prevent displacement by invaders [22]; extracellular polysaccharides (EPS) can smother and starve competitors, while also pushing clone-mates into nutrient-rich environments [18, 23, 24] (Figure 1A). Some microbes, such as *Myxobacteria xanthus* and *Dictyostelium discoideum* produce fruiting bodies to glide toward food sources, and limit the diffusion of extracellular digestive enzymes outside of the fruiting body. In doing so, they achieve both enhanced motility to access new niches, and adhesion to closely related cells to gain biomass and keep competitors away [24, 25].

Similarly to these fruiting bodies, many microbes form cell aggregates – commonly known as biofilms – that protect cells from antimicrobials, predators and other environmental hazards. Inhibiting the formation of these biofilms in others is another competitive strategy [26]. For example, on entry into biofilm, *E. coli* cells produce surfactants and EPS that inhibit biofilm

formation in *Staphylococcus aureus* and *Pseudomonas aeruginosa* [27, 28]. Similarly, *P. aeruginosa* cells swarm over a surface and occupy it to form a biofilm, a behavior termed 'surface blanketing', which prevents *Agrobacterium tumefaciens* from forming its own biofilm [20]. Although the overall cell number of the 'losing' strain is not necessarily reduced on biofilm expulsion, it may nevertheless suffer significant losses under certain conditions, for example in the presence of antibiotics [29, 30]. Analogously, QS inhibition molecules, which are widespread among bacteria, may mediate competition [29, 31-33]. For example, *Bacillus subtilis* produces enzymes that degrade QS molecules in *Vibrio cholerae*, which are subsequently unable to form biofilms [29, 31].

The classical example of interference competition is the production of antimicrobials, which range in their killing spectrum from strain-specific bacteriocins to more broad-spectrum peptides and antibiotics [35, 38] (Figure 1C). Although it has been proposed that at subinhibitory concentrations, antibiotics may be used for cooperative purposes, such as signaling [39, 40], recent data shows otherwise, maintaining the classical understanding of antibiotics as weapons [41, 42]. Other mechanisms of contact-dependent interference competition include type VI secretion systems (T6SS), whereby cells inject syringe-like protrusions containing toxins and other molecules into neighbouring cells that then lyse [5, 34, 43, 44] (Figure 1B). The victim's DNA may also be transferred back into the attacker's cell [5]. The utility of taking up and integrating foreign DNA remains unclear, but some genes, such as those providing toxin immunity and antimicrobial resistance can allow a strain to sweep through to fixation [7, 45, 46].

Many of these competitive phenotypes can be differentially expressed within clonal populations. This variability can enhance a genotype's competitive success [47]. For example, clonal cells within a population can perform different physiological roles, and thereby contribute to a collective functionality [48, 49], such as enhanced growth in nutrient-fluctuating environments [50]. In cyanobacteria, a fraction of the population of cells fixes nitrogen into a usable form, while the rest undergo photosynthesis, together increasing group productivity [47, 51]. Similarly, in the intestinal pathogen *Salmonella enterica* serovar Typhimurium, some cells remain in the host gut lumen and divide, while others invade the tissue and induce an inflammatory response in the host that kills off other bacteria [52]. It is essential to better understand the extent to which such phenotypic heterogeneity occurs, the various roles that different cells can play, and how this can shape competitive interactions (Box 1).

Competition Between Microbes Is Widespread

Given that so many competitive phenotypes have evolved (Table 1), competition must be an important part of microbial life. But how common is it? Are microbes largely living cooperatively with minimal conflict, or is it a constant battlefield of attack and counterattack? When is competition expected?

Data from a number of different ecosystems suggest that competition is prevalent. Genomic analyses show that 25% of Gram-negative bacteria have genes coding for a type VI secretion system [53], while virtually all actinomycetes dedicate 5-10% of their genomes to secondary metabolites [54], which include antibiotics and other potentially damaging molecules. However, we still need to discover the functions of these metabolites – what percentage of them is in fact aggressive – and perform similar analyses in other microbial groups. A powerful approach to assessing the extent of exploitative competition is by using sequence data to build and simulate metabolic models [55, 56]. In one of the first studies using this approach, Freilich *et al.* predicted abundant competition between a collection of widely sampled bacterial species, and few instances of unidirectional positive interactions [55].

Co-culture studies have found similar patterns. Bacterial isolates from tree-holes, which are aquatic ecosystems found around the roots of beech trees, tend to compete with one another in co-culture [57-59]. Soil isolates also grow less well in the presence of other species or even in their filtered growth media [60-62]. Another example comes from the mouse gut. By fitting a generalised **Lotka-Volterra network** model to a dataset quantifying different bacterial sequences over time, Stein *et al.* [63] find that competitive interactions – albeit weak ones – dominate the community [63, 64]. Weak competitive interactions were also found in another microbiome study, this time in humans [65]. Other empirical data from the microbiome indicate that, in agreement with the ‘**habitat filtering**’ principle, species with similar resource requirements tend to live in similar areas of the body [65-67], which may explain local competition. Finally, experiments using mixtures of model bacterial species to study synergistic interactions must rely on evolving or engineering metabolic co-dependence between them as a means to get them to co-exist in the lab, indicating that in their natural state, these species may simply outcompete each other [68-71].

Even though the evidence for the high prevalence of competition is growing, some caveats need to be considered. First, the measured interactions may not be representative of those in the species’ natural environments. For example, because co-culture experiments select for a subset of strains that are able to grow in the lab, they may be more likely to have similar metabolisms and compete with each other on first encounter. Second, genomic analyses suffer from another weakness: to what extent are the genes found in sequence data expressed? The difficulties of antibiotic discovery and biosynthesis indicate that expression levels may indeed be quite low [72, 73]. We discuss the consequences of such experimental and analysis choices in more detail in Box 1.

Assuming that the pattern is real, however, when does competition occur? Why are some strains more aggressive than others? In Figure 2, we summarise our current understanding of the selective forces behind competition. Competition is predicted to be favoured under three conditions: (i) when coexisting strains have overlapping metabolic niches and require similar resources (Figure 2, top row), (ii) when cells of these different strains are spatially mixed on a scale where nutrients and secretions are shared (Figure 2, middle row), and (iii) when cell density is high relative to the available resources, such that they become limiting (Figure 2, bottom row) [74, 75].

There are many environmental factors determining whether these conditions are met (Figure 2, central column). For example, environments with a high nutrient complexity, containing multiple resources or niches can reduce selection for competition [60], particularly if each species is limited by a different resource (**Resource Ratio Theory**) [76, 77]. Similarly, the more phylogenetically similar species within a community are, the more likely they will occupy overlapping metabolic niches and compete for the same resources [78]. Accordingly, distantly related species will tend to consume different resources and co-exist with minimal – or even positive – effects on one another [79, 80]. Even in the absence of phylogenetic similarity through common descent, metabolic overlap may occur through lateral transfer of metabolic genes [7, 45]. It can also result from a lack of environmental disturbances, such that few new strains arrive in the environment bringing in organisms with different metabolic needs [7].

Spatial mixing depends on multiple factors, including nutrient abundance [36, 81], and various mechanical aspects of the environment, such as its viscosity and the diffusivity of different molecules, and the frequency at which it is disturbed [82]. Cardinale [83] showed that a mixture of algal species could only coexist and take on complementary roles in removing nitrate from

stream water if the flow environment was heterogeneous (different flow velocities). A uniform environment instead led to competitive exclusion [83]. Apart from ecological conditions, spatial mixing can also result from a co-dependence on the presence of a cooperating strain [84-87]. Despite these heuristics, however, the effects of environmental manipulations on competition are not straightforward to predict. Indeed, the same manipulation – for example increased viscosity or the frequency of environmental disturbances – may simultaneously drive selection for competition in opposite directions (Figure 2).

A recently proposed ‘competition sensing’ hypothesis suggests that cells may be able to detect and respond to competition [89, 90], whereby physiological stress responses induced by the presence of competitors are used to regulate competitive phenotypes. Some cells can then recognise and tune their responses depending on whether they sense competition through a lack of nutrients, or cellular damage [89, 90]. Consistent with this, *P. aeruginosa* cells can detect antibiotics, and induce the formation of biofilms [91]. They can also detect when neighbouring *P. aeruginosa* cells are killed, and trigger a counterattack using their T6SS [92]. *B. subtilis* cells in biofilms are able to detect nearby *Bacillus simplex* biofilms and secrete lethal toxins that kill them [93]. The presence of neighbouring colonies also alters the competitive behaviour of many species of soil bacteria [37, 41, 60] (Figure 1E). Depending on the identity of a neighbouring colony, a species pair can either upregulate or suppress its antibiotic production [41, 94].

Consequences of Competition Over Time

Most microbial communities studied in the lab are snapshots in time resulting from a history of interactions between individual cells and genotypes. But what are the consequences of competition over ecological and evolutionary time-scales? Two key measures are of interest when predicting the dynamics of a community: its diversity, and its stability.

Overall, competition is predicted to lead to a local reduction in diversity – where ‘local’ refers to the scale at which cells have fitness effects on each other – and an increase in **ecological stability** [64, 95]. However, this may occur in a number of different ways (Figure 3, Key Figure). Three ecologically stable outcomes of competition are well accepted (Figure 3A-C): (i) that the less competitive strains go extinct while others dominate the community [79, 96], (ii) that strains continue to coexist by occupying different metabolic niches, where each specialises on a different resource type, or (iii) that strains separate into different spatial niches or patches.

A nice set of examples of niche differentiation in resources (Figure 3B) comes from experimental evolution in the tree-hole communities mentioned above [57-59], where initially competing species diverged in their use of resources as they co-evolved. The species even evolved to use each other’s waste products and increase overall productivity, suggesting that even when new niches are absent, species in the community can create and exploit alternative resources within the niche. Following niche differentiation then, competition can become neutralised through a reduction in interaction strength, potentially leading to symbiotic relationships and productive communities [58]. Co-existence of competitors through spatial separation (Figure 3C) is possible in solid or semi-solid structures such as mucus, soil, the surface of a leaf or an agar surface, which consist of many spatial niches. This has been studied extensively in microbial colonies that begin from well-mixed populations containing millions of competing cells that expand outwards onto an agar surface and form clonal patches [36, 97, 98]. Although this process begins with the competitive exclusion of much of the original population, coexistence of multiple strains is possible in separate spatial areas, and has been shown in many different organisms and systems [71, 75, 99, 100] (Figure 1D).

We outline three other possible scenarios following competition whose dynamics are currently less well established: First, strains may stably coexist in the same niche in a parasitic relationship (Figure 3D). The recent Black Queen Hypothesis suggests that in a group of species in which a public good is required, if all but one species lose the ability to produce it, the producing species must continue to produce to avoid its own extinction, even if it benefits others [11-13, 101]. Similar equilibria have been described for cooperators and cheats of the same species [102-105], and for rock-paper-scissor dynamics, where cyclic dynamics occur between antibiotic producers, resistant cells (immune but do not attack) and sensitive cells [106, 107]. These ideas are supported by experimental evidence, for example in siderophore production in marine bacteria [13]. While such communities may be ecologically stable and remain diverse, their **evolutionary stability** is questionable, since producers may evolve to produce more private or less costly secretions [103], to eliminate their competitors through interference competition, or exploiters may evolve to produce something in return, leading to a cooperative exchange with the producer [101, 108].

Second (Figure 3E), if strains are unable to escape or avoid their competitors, they may maintain their aggressive phenotypes, increasingly ramp them up or diversify them in an arms race [82]. An arms race is an evolutionary process rather than an outcome of competition, and may eventually lead to one of the other outcomes (e.g. competitive exclusion). Otherwise, theory and experiments have shown that aggressive phenotypes and resistance to them can be maintained in a stable equilibrium in spatially structured populations [19, 35, 107, 109]. The dynamics of stability and diversity, then, strongly depend on environmental conditions, and the nature of the competitive phenotypes. Phenotypes that incur a higher cost, for example, may be less readily maintained [35, 110]. A study in soil bacteria found that there is a trade-off between two strategies: investing into efficient growth or into aggressive phenotypes such as antibiotics [111], a choice that may depend on environmental conditions (Figure 2), such as population density [112]. Soil *Streptomyces* indeed produce an exceptional range of antibiotics targeting many different species, which may be due to liquid flow in the soil, leading to more spatial mixing [81], or an increased probability of invasion. Another possibility is that as weaker strains get outcompeted in the soil, diversity is reduced. And because high diversity isolates competitors from each other through buffer zones [85, 113], novel warfare may be enhanced between the remaining strains as the buffer zones disappear.

A final scenario (Figure 3F) that has only recently been proposed, is that warfare between two strains can be neutralised by other community members, as has been found in studies on antibiotic antagonism [41, 94]. Kelsic *et al.* [94] have theoretically shown that this can lead to ecologically stable equilibria wherein different species neutralise all produced antibiotics, and diversity is maintained. On an evolutionary time-scale, however, one might expect these protective mechanisms to break down.

In sum, competition generally reduces diversity and increases ecological stability on a local scale, although some exceptions exist. Which of the long-term dynamics are expected as a consequence of competition on a larger scale likely depends on the selection pressures of a given environment as listed above and in Figure 2. In fact, in different areas of the same environment, selection may result in an arms race in one area, competitive exclusion in a second and a synergistic division of labour in a third [114]. Exactly how these factors would influence diversity, stability and the prevalence of competition and cooperation needs to be addressed by future research.

Concluding Remarks

Microbes grow in challenging environments where scarce resources must be shared with many other strains and species. Under these conditions, microbes have evolved many competitive strategies, including rapid growth to take up resources, direct aggression to eliminate or displace others, or alternative metabolisms that benefit from and exploit the presence of competitors. While this may sound like a highly aggressive microbial world, evidence suggests that competition often drops over time, leading to stable equilibria involving weak interactions between strains that have either eliminated their competitors, or partitioned the available niches and space.

Decades of research are responsible for the details of this picture. Nevertheless, it remains preliminary. More effort will be needed to understand how these findings generalise. In particular, apart from the classical outcomes of competition, other evolutionary outcomes are less well understood and merit further focus (see Outstanding Questions). Microbial systems are excellent models to test such ecological and evolutionary predictions with scope for developing methods to compare microbial communities, and disentangle interactions within them. Progress toward this goal can be accelerated through increased exchange between ecologists and social evolutionary biologists, as well as researchers studying model systems and environmental samples (Box 1). Such collaboration would lead to more accurate and informed predictions on the nature of interactions in microbial communities. The ability to make such predictions can have many important implications in the management and design of microbial communities, whether to increase competition in soil communities to prevent the invasion of pathogens [82], or to decrease competition and thereby increase productivity in biofuel-producing communities [115]. A good understanding of microbial competition can result in expert microbial bioengineering.

Box 1. Approaches and limitations to studying microbial competition

Studying microbial competition involves different levels of abstraction. The daunting complexity of a microbial community can be approached from the bottom-up, by focusing on a small aspect or a subpopulation that is dissectable and understandable. In contrast, top-down approaches allow a bird's-eye-view of a community and the interactions within it, which lacks in-depth understanding, but covers as many components as possible.

A powerful top-down approach to studying community interactions is using genomic, transcriptomic and metabolomic data. A first analysis often involves constructing co-occurrence networks by calculating correlations in the abundance of species pairs [116, 117]. These networks capture how diversity and species composition change over different community samples, but are not necessarily suited to interpreting interspecies interactions. This is because it is impossible to tell whether a negative correlation between a species pair is due to competitive exclusion or habitat filtering [65]. Interactions can instead be predicted by building metabolic models for different species, and simulating their growth under different resource compositions. This method has been widely applied, and standardised tools are becoming available [55, 56, 65, 78, 118]. However, only rarely are other social phenotypes taken into account, such as secondary metabolites (Table 1, [119]). Furthermore, the models are based on the presence or absence of genes, regardless of whether they are expressed in reality. This can be resolved using transcriptomics, by studying gene expression profiles in addition to screening for variation in the expression of genes in complexes that share the same promoter, e.g.

bacteriocin production and immunity operons, which were previously thought to be equally expressed [120]. Finally, metabolomics can make more stringent links between gene expression and observed phenotypes by correlating them with cellular and secreted metabolites [121].

Bottom-up approaches include co-culturing different strain combinations in the lab, which is an intuitive and powerful technique where the effects of careful manipulations can be monitored over time. However, a number of issues are relevant for interpreting the results. Firstly, only a minority of environmental isolates will manage to grow in the laboratory, biasing towards lower metabolic diversity and higher competition (Figure 2). In particular, strains that rely on the presence of others to grow – where one would detect a positive interaction – will be excluded [122]. Secondly, species may meet in the lab that would never meet in reality, possibly triggering an aggressive response. This may be the case in experiments involving interactions between ‘model’ bacterial species, such as *E. coli* or *P. aeruginosa*. Finally, growth in the lab often occurs over short time-scales [96] in liquid cultures lacking spatial structure, and containing relatively high concentrations of nutrients whose composition is somewhat arbitrary and will certainly affect interactions [55, 65]. Assuming that these problems can be weeded out, however, co-cultures generate high-resolution data, which can be used to seed models of co-growth, such as generalised Lotka-Volterra models [63, 123].

Another general problem is that studies typically consider whole populations and ignore phenotypic variation between individual cells. As the technology of single-cell microbiology advances, methods for taking this diversity into account are becoming more readily available. Furthermore, the spatial organisation of strains in the original environment is typically destroyed through sampling. Two co-isolated strains that are found to compete in the lab may actually live in separate clonal patches that are millimeters away. Accordingly, sampling is likely to exaggerate both diversity and competition between strains. There is then a need for sampling methods that conserve spatial structure, such as fluorescent *in situ* microscopy, where one can follow the identity and gene expression of individual cells over different areas and over time. These approaches have advanced significantly in recent years [124].

Finally, theoretical approaches have been and can be extremely valuable in capturing and predicting the ecology and evolution of competitive interactions, particularly over large data-sets and large (evolutionary) time-scales, which are difficult to follow experimentally. These include the genomic models discussed above, which have so far focused on metabolomics, spatially-explicit computer simulations, which can predict the role of space on competition between genotypes [23, 81, 84, 85, 101, 125, 126], and more abstract models, such as network models wherein diversity and stability can be calculated analytically [64, 95] or social evolution models that can make predictions on the frequencies of different traits and how selection will shape them over time [127, 109].

Glossary

Competition: consider two strains A and B that differ on one or more loci. Strain A is a competitor of B if (a) B has a lower fitness in A’s presence relative to its absence; (b) the phenotype in A resulting in fitness change in B occurs only in the long- or short-term presence of B; and (c) A and B require similar nutrients and space. Note that this definition is context-dependent. The competitive phenotype is not necessarily only expressed upon interaction with a competitor but can be constitutively expressed provided it is likely to be responsible for the fitness change during competitive interactions.

Diversity: number of strains or species in a community (however they may be distinguished, e.g. OTUs at 97%, or differentially labelled strains; a community also needs to be spatially delimited, e.g. a microbial colony, or strains living in the human oral tract).

Ecological stability: the probability that a community will return to its previous state following a small perturbation. We use this definition broadly to include measures such as resilience (the speed at which a community returns to its previous state) and permanence (all original species are maintained in the community) [64].

Evolutionary stability: evolutionary stability refers to evolutionary stable strategies (ESS), a game-theoretic concept whereby a population maintaining that strategy cannot be invaded by any alternative strategy that is initially rare [128].

Fitness: here we use fitness as a proxy for the rate of division and survival relative to the interacting competitors' division and survival.

Habitat filtering: the habitat filtering principle predicts that phylogenetically similar species will tend to co-occur because the environment selects for species that are adapted to it.

Lotka-Volterra network: a system of differential equations that describes the population dynamics of two or more interacting groups (typically species).

Resource Ratio Theory: this theory states that a species in a community that is able to survive on the lowest abundance of a given nutrient will dominate the community if it is limiting. In the presence of two limiting nutrients, it predicts that two species may coexist, provided that each is limited by one of the nutrients.

Figure Legends

Figure 1. Competitive Phenotypes. (A) Secretions by a *Pseudomonas fluorescens* mutant (green), allowing it to break through and colonise the top of the colony of the wild-type strain (red) and eventually outgrow it [18]. Left: whole colony, right: zoomed in view of box in the left panel. (B) T6SSs in *Vibrio cholerae* (red, *mCherry2*) and *P. aeruginosa* (green, *gfp*) on cell contact leads to the lysis of *V. cholerae* cell (arrow) by 40s, 4.5 x 4.5 µm images are shown [34]. (C) Soft agar plate with one central colony of colicin-producing *E. coli*, surrounded by an inhibition zone and colonies of sensitive bacteria [35]. (D) Competitive exclusion in space. A drop with a 1:1 mixture of *P. aeruginosa* cells labelled in either blue or yellow fluorescent protein is left to grow into a colony. Over time, lineages from the centre die off, while only a few clonal patches grow toward the colony edge [36]. (E) *Streptomyces coelicolor* responds to the presence of other actinomycetes. Left panel: *S. coelicolor* alone, other panels show *S. coelicolor* on the right and a second species on the left. *S. coelicolor* colonies exhibit different phenotypes depending on the partner's identity [37].

Figure 2. When to Expect Competition. Ecological conditions leading to high selection for the acquisition or expression of competitive phenotypes include (i) high niche overlap between strains, (ii) if they are well-mixed over a spatial scale that is relevant for interactions and (iii) if cells are at a high density relative to available resources. Whether these conditions are met depends on environmental factors listed in the centre (high or low: darker or lighter shading, arrow pointing up or down, respectively) such as nutrient abundance, its complexity, the rate at which other strains are entering the group from the outside [88], the phylogenetic diversity within the community, whether cells are motile or not, whether their environment is viscous and how often it is disturbed in a way that disperses cells to new locations, reducing phylogenetic and spatial structure. Note that the same factor may have opposing effects in promoting the conditions for or against competition (e.g. viscosity allow cells to form clonal patches to avoid competitors, but also leads to high cell density since it is harder for cells to migrate, which selects for increased competition).

Figure 3. Predicted Long-term Consequences of Competition. We show three strains of bacteria that compete with one another initially (high competition, high diversity and low stability, see top left) and the

possible outcomes of this competition as proposed in the literature. Under the top three scenarios (A-C), we plot the predicted dynamics in competition, community diversity and ecological stability over time, beginning from high competition and diversity and low stability. The dynamics of competition, diversity and stability in the bottom three scenarios (D-F) are less well understood. Dashed lines represent theoretical predictions that have not yet been extensively tested experimentally.

Table 1. Competitive Phenotypes in Microbes

| Competitive phenotype | Example of molecule type | Competitive effect | Refs |
|---|--|---|----------------------------|
| Digestive enzyme secretion | Proteases | Digest complex nutrients for growth | [16, 29] |
| Siderophore secretion | Pyoverdine | Bind and scavenge iron for growth | [129, 130] |
| Production of structural and motility molecules | Surfactants, rhamnolipids, EPS, proteins, DNA, adhesion and anti-adhesion molecules | Maintain established niche or colonise a new niche | [18, 20, 22, 24, 131, 132] |
| Antibiotic production | Bacteriocins, toxins, peptides | Lysis of competitor via non-contact dependent chemical warfare | [35, 38, 99] |
| Type VI secretion systems (T6SS) | Stabbing structures that release lethal effector molecules and enzymes | Lysis of competitor via contact dependent chemical warfare | [5, 34, 43, 44] |
| Altering metabolic regulation | - | Better utilisation of substrates in variable environments | [8-10, 47, 133] |
| Reduced expression of costly genes | Secreted molecules that act as public goods, e.g. digestive enzymes and siderophores | Exploit production of higher producing cells, resulting in growth advantage | [13, 16, 102, 105, 130] |
| Production of non-biocidal molecules | Surfactin, anti-adhesion molecules, nucleases, proteases | Disperse competitors out of niche, degrade biofilm matrix | [27, 28, 134, 135] |
| Inhibit quorum sensing | Quorum sensing inhibitors or quenchers | Inhibit cell-to-cell communication | [32, 33, 136] |

References

1 Barber, M.F. and Elde, N.C. (2015) Buried Treasure: Evolutionary Perspectives on Microbial Iron Piracy. *Trends in Genetics* 31, 627-636

476 2 Bren, A., *et al.* (2013) The last generation of bacterial growth in limiting nutrient. *BMC*
 477 *Systems Biology* 7, 1
 478 3 Aldén, L., *et al.* (2001) Rapid method of determining factors limiting bacterial growth in soil.
 479 *Applied and environmental microbiology* 67, 1830-1838
 480 4 Kehl-Fie, T.E. and Skaar, E.P. (2010) Nutritional immunity beyond iron: a role for manganese
 481 and zinc. *Current opinion in chemical biology* 14, 218-224
 482 5 Borgeaud, S., *et al.* (2015) The type VI secretion system of *Vibrio cholerae* fosters horizontal
 483 gene transfer. *Science* 347, 63-67
 484 6 Freese, P.D., *et al.* (2014) Genetic drift suppresses bacterial conjugation in spatially structured
 485 populations. *Biophysical Journal* 106, 944-954
 486 7 Niehus, R., *et al.* (2015) Migration and horizontal gene transfer divide microbial genomes into
 487 multiple niches. *Nature Communications* 6, 8924
 488 8 MacLean, R.C. and Gudelj, I. (2006) Resource competition and social conflict in experimental
 489 populations of yeast. *Nature* 441, 498-501
 490 9 Pfeiffer, T., *et al.* (2001) Cooperation and competition in the evolution of ATP-producing
 491 pathways. *Science* 292, 504-507
 492 10 Vulic, M. and Kolter, R. (2001) Evolutionary Cheating in *Escherichia coli* Stationary Phase
 493 Cultures. *Genetics* 158, 519-526
 494 11 Morris, J.J. (2015) Black Queen evolution: the role of leakiness in structuring microbial
 495 communities. *Trends in Genetics* 31, 475-482
 496 12 Morris, J.J., *et al.* (2012) The Black Queen Hypothesis: evolution of dependencies through
 497 adaptive gene loss. *mBio* 3, e00036-12
 498 13 Cordero, O.X., *et al.* (2012) Public good dynamics drive evolution of iron acquisition
 499 strategies in natural bacterioplankton populations. *Proceedings of the National Academy of*
 500 *Sciences* 109, 20059-20064
 501 14 Ghoul, M., *et al.* (2014) An experimental test of whether cheating is context dependent.
 502 *Journal of Evolutionary Biology* 27, 551-556
 503 15 Kümmerli, R., *et al.* (2009) Viscous medium promotes cooperation in the pathogenic
 504 bacterium *Pseudomonas aeruginosa*. *Proc R Soc Lond Biol* 276, 3531-3538
 505 16 Diggle, S.P., *et al.* (2007) Cooperation and conflict in quorum-sensing bacterial populations.
 506 *Nature* 450, 411-U417
 507 17 Schuster, M., *et al.* (2013) Acyl-homoserine lactone quorum sensing: from evolution to
 508 application. *Annual Review of Microbiology* 67, 43-63
 509 18 Kim, W., *et al.* (2014) Importance of positioning for microbial evolution. *Proceedings of the*
 510 *National Academy of Sciences of the United States of America* 111, E1639-1647
 511 19 Bucci, V., *et al.* (2011) The evolution of bacteriocin production in bacterial biofilms. *The*
 512 *American naturalist* 178, E162-173
 513 20 An, D., *et al.* (2006) Quorum sensing and motility mediate interactions between
 514 *Pseudomonas aeruginosa* and *Agrobacterium tumefaciens* in biofilm cocultures. *Proceedings of*
 515 *the National Academy of Sciences of the United States of America* 103, 3828-3833
 516 21 Kim, W., *et al.* (2016) Rapid radiation in bacteria leads to a division of labour. *Nature*
 517 *Communications* 7, 10508
 518 22 Schluter, J., *et al.* (2015) Adhesion as a weapon in microbial competition. *The ISME journal*
 519 9, 139-149
 520 23 Xavier, J.B. and Foster, K.R. (2007) Cooperation and conflict in microbial biofilms. *PNAS*
 521 104, 876 - 881
 522 24 Nadell, C.D. and Bassler, B.L. (2011) A fitness trade-off between local competition and
 523 dispersal in *Vibrio cholerae* biofilms. *PNAS* 108, 14181-14185
 524 25 Hibbing, M.E., *et al.* (2010) Bacterial competition: Surviving and thriving in the microbial
 525 jungle. *Nature Reviews Microbiology* 8, 15-25

526 26 Stacy, A., *et al.* (2016) The biogeography of polymicrobial infection. *Nature Reviews*
 527 *Microbiology* 14, 93-105
 528 27 Rendueles, O., *et al.* (2011) Screening of *Escherichia coli* species biodiversity reveals new
 529 biofilm-associated antiadhesion polysaccharides. *mBio* 2, e00043-00011
 530 28 Valle, J., *et al.* (2006) Broad-spectrum biofilm inhibition by a secreted bacterial
 531 polysaccharide. *Proceedings of the National Academy of Sciences of the United States of*
 532 *America* 103, 12558-12563
 533 29 Rendueles, O. and Ghigo, J.-M. (2012) Multi-species biofilms: how to avoid unfriendly
 534 neighbors. *FEMS microbiology reviews* 36, 972-989
 535 30 Anderson, G. and O'Toole, G. (2008) Innate and induced resistance mechanisms of bacterial
 536 biofilms. *Current Topics in Microbiology & Immunology* 322, 85-105
 537 31 Augustine, N., *et al.* (2010) Inhibition of *Vibrio cholerae* biofilm by AiiA enzyme produced
 538 from *Bacillus* spp. *Archives of Microbiology* 192, 1019-1022
 539 32 Musthafa, K.S., *et al.* (2011) Antipathogenic potential of marine *Bacillus* sp. SS4 on N-acyl-
 540 homoserine-lactone-mediated virulence factors production in *Pseudomonas aeruginosa*
 541 (PAO1). *J Biosciences* 36, 55-67
 542 33 Christiaen, S., *et al.* (2011) Isolation and identification of quorum quenching bacteria from
 543 environmental samples. *Journal of Microbiology Methods* 87, 213-219
 544 34 Basler, M., *et al.* (2013) Tit-for-Tat: Type VI Secretion System Counterattack during Bacterial
 545 Cell-Cell Interactions. *Cell* 152, 884-894
 546 35 Chao, L. and Levin, B.R. (1981) Structured habitats and the evolution of anticompetitor
 547 toxins in bacteria. *Proceedings of the National Academy of Sciences of the United States of*
 548 *America* 78, 6324-6328
 549 36 Mitri, S., *et al.* (2015) Resource limitation drives spatial organization in microbial groups. *The*
 550 *ISME journal* 10, 1471-1482
 551 37 Traxler, M.F., *et al.* (2013) Interspecies interactions stimulate diversification of the
 552 *Streptomyces coelicolor* secreted metabolome. *mBio* 4, e00459-13
 553 38 Riley, M.A. and Gordon, D.M. (1999) The ecological role of bacteriocins in bacterial
 554 competition. *Trends Microbiol* 7, 129-133
 555 39 Davies, J., *et al.* (2006) The world of subinhibitory antibiotic concentrations. *Current opinion*
 556 *in microbiology* 9, 445-453
 557 40 Romero, D., *et al.* (2011) Antibiotics as signal molecules. *Chemical reviews* 111, 5492-5505
 558 41 Abrudan, M.I., *et al.* (2015) Socially mediated induction and suppression of antibiosis during
 559 bacterial coexistence. *Proceedings of the National Academy of Sciences of the United States of*
 560 *America* 112, 11054-11059
 561 42 Cornforth, D.M. and Foster, K.R. (2015) Antibiotics and the art of bacterial war. *Proceedings*
 562 *of the National Academy of Sciences of the United States of America* 112, 10827-10828
 563 43 Russell, A.B., *et al.* (2014) Type VI secretion system effectors: poisons with a purpose.
 564 *Nature Reviews Microbiology* 12, 137-148
 565 44 Macintyre, D.L., *et al.* (2010) The *Vibrio cholerae* type VI secretion system displays
 566 antimicrobial properties. *PNAS* 107, 19520-19524
 567 45 Shapiro, B.J., *et al.* (2012) Population genomics of early events in the ecological
 568 differentiation of bacteria. *Science* 336, 48-51
 569 46 Takeuchi, N., *et al.* (2015) Gene-specific selective sweeps in bacteria and archaea caused
 570 by negative frequency-dependent selection. *BMC Biology* 13, 20
 571 47 Ackermann, M. (2015) A functional perspective on phenotypic heterogeneity in
 572 microorganisms. *Nature Reviews Microbiology* 13, 497-508
 573 48 Stewart, P.S. and Franklin, M.J. (2008) Physiological heterogeneity in biofilms. *Nature*
 574 *reviews. Microbiology* 6, 199-210
 575 49 Chai, Y.R., *et al.* (2008) Bistability and biofilm formation in *Bacillus subtilis*. *Mol Microbiol* 67,
 576 254-263

577 50 Schreiber, F., *et al.* (2016) Phenotypic heterogeneity driven by nutrient limitation promotes
578 growth in fluctuating environments. *Nature Microbiology* 1, 16055

579 51 Flores, E. and Herrero, A. (2010) Compartmentalized function through cell differentiation in
580 filamentous cyanobacteria. *Nature Reviews Microbiology* 8, 39-50

581 52 Diard, M., *et al.* (2013) Stabilization of cooperative virulence by the expression of an avirulent
582 phenotype. *Nature* 494, 353-356

583 53 Boyer, F., *et al.* (2009) Dissecting the bacterial type VI secretion system by a genome wide
584 in silico analysis: what can be learned from available microbial genomic resources? *BMC*
585 *genomics* 10, 104

586 54 Nett, M., *et al.* (2009) Genomic basis for natural product biosynthetic diversity in the
587 actinomycetes. *Natural Product Reports* 26, 1362-1384

588 55 Freilich, S., *et al.* (2011) Competitive and cooperative metabolic interactions in bacterial
589 communities. *Nature Communications* 2, 589

590 56 O'Brien, E., *et al.* (2015) Using genome-scale models to predict biological capabilities. *Cell*
591 161, 971-987

592 57 Lawrence, D., *et al.* (2012) Species Interactions Alter Evolutionary Responses to a Novel
593 Environment. *PLoS Biology* 10, e1001330

594 58 Rivett, D.W., *et al.* (2016) Resource-dependent attenuation of species interactions during
595 bacterial succession. *The ISME journal* doi: 10.1038/ismej.2016.11

596 59 Fiegna, F., *et al.* (2015) Evolution of species interactions determines microbial community
597 productivity in new environments. *The ISME Journal* 9, 1235-1245

598 60 Kinkel, L.L., *et al.* (2014) Sympatric inhibition and niche differentiation suggest alternative
599 coevolutionary trajectories among *Streptomyces*. *The ISME journal* 8, 249-256

600 61 Schulz-Bohm, K., *et al.* (2015) A fragrant neighborhood: volatile mediated bacterial
601 interactions in soil. *Frontiers in Microbiology* 6, 1-11

602 62 Vetsigian, K., *et al.* (2011) Structure and evolution of *Streptomyces* interaction networks in
603 soil and in silico. *PLoS Biology* 9, e1001184

604 63 Stein, R.R., *et al.* (2013) Ecological modeling from time-series inference: insight into
605 dynamics and stability of intestinal microbiota. *PLoS computational biology* 9, e1003388

606 64 Coyte, K.Z., *et al.* (2015) The ecology of the microbiome: Networks, competition, and
607 stability. *Science* 350, 663-666

608 65 Levy, R. and Borenstein, E. (2013) Metabolic modeling of species interaction in the human
609 microbiome elucidates community-level assembly rules. *Proceedings of the National Academy*
610 *of Sciences of the United States of America* 110, 12804-12809

611 66 Bik, E.M., *et al.* (2010) Bacterial diversity in the oral cavity of 10 healthy individuals. *The*
612 *ISME journal* 4, 962-974

613 67 Smillie, C.S., *et al.* (2011) Ecology drives a global network of gene exchange connecting the
614 human microbiome. *Nature* 480, 241-244

615 68 Harcombe, W. (2010) Novel cooperation experimentally evolved between species. *Evolution*
616 64, 2166-2172

617 69 Shou, W., *et al.* (2007) Synthetic cooperation in engineered yeast populations. *Proceedings*
618 *of the National Academy of Sciences of the United States of America* 104, 1877-1882

619 70 Pande, S., *et al.* (2015) Metabolic cross-feeding via intercellular nanotubes among bacteria.
620 *Nature Communications* 6, 6238

621 71 Hansen, S.K., *et al.* (2007) Evolution of species interactions in a biofilm community. *Nature*
622 445, 533-536

623 72 Fischbach, M.A. and Walsh, C.T. (2009) Antibiotics for Emerging Pathogens. *Science* 325,
624 1089-1093

625 73 Livermore, D.M. and Antimicrobial, B.S. (2011) Discovery research: the scientific challenge
626 of finding new antibiotics. *J Antimicrob Chemoth* 66, 1941-1944

627 74 van Gestel, J., *et al.* (2014) Density of founder cells affects spatial pattern formation and
 628 cooperation in *Bacillus subtilis* biofilms. *The ISME journal* 8, 2069-2079
 629 75 Lloyd, D.P. and Allen, R.J. (2015) Competition for space during bacterial colonization of a
 630 surface. *Journal of the Royal Society Interface* 12, 20150608
 631 76 Bellucci, M., *et al.* (2015) A preliminary and qualitative study of resource ratio theory to
 632 nitrifying lab-scale bioreactors. *Microbial Biotechnology* 8, 590-603
 633 77 Miller, T.E., *et al.* (2005) A critical review of twenty years' use of the Resource-Ratio Theory.
 634 *The American Naturalist* 165, 439-448
 635 78 Zelezniak, A., *et al.* (2015) Metabolic dependencies drive species co-occurrence in diverse
 636 microbial communities. *Proceedings of the National Academy of Sciences* 112, 201421834
 637 79 Hardin, G. (1960) The competitive exclusion principle. *Science* 131, 1292-1297
 638 80 Mitri, S. and Foster, K.R. (2013) The Genotypic View of Social Interactions in Microbial
 639 Communities. *Annual Review of Genetics* 47, 247-273
 640 81 Nadell, C.D., *et al.* (2010) Emergence of spatial structure in cell groups and the evolution of
 641 cooperation. *PLoS Computational Biology* 6, e1000716
 642 82 Kinkel, L.L., *et al.* (2011) A coevolutionary framework for managing disease-suppressive
 643 soils. *Annual Reviews of Phytopathology* 49, 47-67
 644 83 Cardinale, B.J. (2011) Biodiversity improves water quality through niche partitioning. *Nature*
 645 472, 86-89
 646 84 Momeni, B., *et al.* (2013) Spatial self-organization favors heterotypic cooperation over
 647 cheating. *eLife* 2, 1-18
 648 85 Mitri, S., *et al.* (2011) Social evolution in multispecies biofilms. *PNAS* 108, 10839-10846
 649 86 Muller, M.J.I., *et al.* (2014) Genetic drift opposes mutualism during spatial population
 650 expansion. *Proceedings of the National Academy of Sciences* 111, 1037-1042
 651 87 Estrela, S. and Brown, S.P. (2013) Metabolic and Demographic Feedbacks Shape the
 652 Emergent Spatial Structure and Function of Microbial Communities. *PLoS Computational*
 653 *Biology* 9, e1003398
 654 88 Kerr, B., *et al.* (2006) Local migration promotes competitive restraint in a host-pathogen
 655 'tragedy of the commons'. *Nature* 442, 75-78
 656 89 Cornforth, D.M. and Foster, K.R. (2013) Competition sensing: the social side of bacterial
 657 stress responses. *Nature Reviews Microbiology* 11, 285-293
 658 90 LeRoux, M., *et al.* (2015) Bacterial danger sensing. *Journal of molecular biology* 427, 3744-
 659 3753
 660 91 Oliveira, N.M., *et al.* (2015) Biofilm formation as a response to ecological competition. *PLoS*
 661 *Biology* 13, e1002232
 662 92 LeRoux, M., *et al.* (2015) Kin cell lysis is a danger signal that activates antibacterial
 663 pathways of *Pseudomonas aeruginosa*. *eLife* 4, e05701
 664 93 Rosenberg, G., *et al.* (2016) Not so simple, not so subtle: the interspecies competition
 665 between *Bacillus simplex* and *Bacillus subtilis* and its impact on the evolution of biofilms. *npj*
 666 *Biofilms and Microbiomes* 2, 15027
 667 94 Kelsic, E.D., *et al.* (2015) Counteraction of antibiotic production and degradation stabilizes
 668 microbial communities. *Nature* 521, 516-519
 669 95 Allesina, S. and Levine, J.M. (2011) A competitive network theory of species diversity.
 670 *Proceedings of the National Academy of Sciences of the United States of America* 108, 5638-
 671 5642
 672 96 Louca, S. and Doebeli, M. (2015) Transient dynamics of competitive exclusion in microbial
 673 communities. *Environmental microbiology* 18, 1863-1874
 674 97 Hallatschek, O., *et al.* (2007) Genetic drift at expanding frontiers promotes gene segregation.
 675 *PNAS* 104, 19926-19930
 676 98 Korolev, K.S., *et al.* (2012) Selective sweeps in growing microbial colonies. *Physical biology*
 677 9, 026008

678 99 Kerr, B., *et al.* (2002) Local dispersal promotes biodiversity in a real-life game of rock-paper-
 679 scissors. *Nature* 418, 171-174
 680 100 Rainey, P.B. and Travisano, M. (1998) Adaptive radiation in a heterogeneous environment.
 681 *Nature* 394, 69-72
 682 101 Estrela, S., *et al.* (2015) Private benefits and metabolic conflicts shape the emergence of
 683 microbial interdependencies. *Environmental microbiology* 18, 1415-1427
 684 102 Gore, J., *et al.* (2009) Snowdrift game dynamics and facultative cheating in yeast. *Nature*
 685 459, 253-256
 686 103 Morris, J.J., *et al.* (2014) Coexistence of evolving bacteria stabilized by a shared Black
 687 Queen function. *Evolution* 68, 2960-2971
 688 104 Sanchez, A. and Gore, J. (2013) Feedback between Population and Evolutionary Dynamics
 689 Determines the Fate of Social Microbial Populations. *PLoS Biology* 11, e1001547
 690 105 Diard, M., *et al.* (2013) Stabilization of cooperative virulence by the expression of an
 691 avirulent phenotype. *Nature* 494, 353-358
 692 106 Narisawa, N., *et al.* (2008) Coexistence of antibiotic-producing and antibiotic-sensitive
 693 bacteria in biofilms is mediated by resistant bacteria. *Applied and environmental microbiology*
 694 74, 3887-3894
 695 107 Czárán, T.L., *et al.* (2002) Chemical warfare between microbes promotes biodiversity.
 696 *PNAS* 99, 786-790
 697 108 Sachs, J.L. (2012) The origins of cooperative bacterial communities. *mBio* 3, e00099-00012
 698 109 Biernaskie, J., *et al.* (2013) Multicoloured greenbeards, bacteriocin diversity and the rock-
 699 paper-scissors game. *Journal of Evolutionary Biology* 26, 2081-2094
 700 110 Borenstein, D.B., *et al.* (2015) Established Microbial Colonies Can Survive Type VI
 701 Secretion Assault. *PLoS computational biology* 11, e1004520
 702 111 Schlatter, D.C. and Kinkel, L.L. (2015) Do tradeoffs structure antibiotic inhibition, resistance,
 703 and resource use among soil-borne *Streptomyces*? *BMC evolutionary biology* 15, 186
 704 112 Conlin, P.L., *et al.* (2014) Games of life and death: antibiotic resistance and production
 705 through the lens of evolutionary game theory. *Current opinion in microbiology* 21, 35-44
 706 113 Celiker, H. and Gore, J. (2012) Competition between species can stabilize public-goods
 707 cooperation within a species. *Molecular systems biology* 8, 621
 708 114 Thompson, J.N. (2005) *The Geographic Mosaic of Coevolution*. The University of Chicago
 709 Press
 710 115 Fredrickson, J.K. (2015) Ecological communities by design. *Science* 348, 1425-1427
 711 116 Faust, K., *et al.* (2015) Cross-biome comparison of microbial association networks.
 712 *Frontiers in Microbiology* 6, 1200
 713 117 Lima-Mendez, G., *et al.* (2015) Determinants of community structure in the global plankton
 714 interactome. *Science* 348, 1262073
 715 118 Berry, D. and Widder, S. (2014) Deciphering microbial interactions and detecting keystone
 716 species with co-occurrence networks. *Frontiers in Microbiology* 5, 1-14
 717 119 Embree, M., *et al.* (2015) Networks of energetic and metabolic interactions define dynamics
 718 in microbial communities. *PNAS* 112, 15450-15455
 719 120 Güell, M., *et al.* (2011) Bacterial transcriptomics: what is beyond the RNA hori-z-ome?
 720 *Nature Reviews Microbiology* 9, 658-669
 721 121 Patti, G.J., *et al.* (2012) Innovation: Metabolimics: the apogee of the omics trilogy. *Nature*
 722 *Reviews Molecular Cell Biology* 13, 263-269
 723 122 Ernebjerg, M. and Kishony, R. (2012) Distinct growth strategies of soil bacteria as revealed
 724 by large-scale colony tracking. *Applied and Environmental Microbiology* 78, 1345-1352
 725 123 Mounier, J., *et al.* (2008) Microbial Interactions within a Cheese Microbial Community.
 726 *Applied and Environmental Microbiology* 74, 172-181
 727 124 Wessel, A.K., *et al.* (2013) Going local: technologies for exploring bacterial
 728 microenvironments. *Nature Reviews Microbiology* 11, 337-348

125 Harcombe, William R., *et al.* (2014) Metabolic Resource Allocation in Individual Microbes
Determines Ecosystem Interactions and Spatial Dynamics. *Cell Reports* 7, 1104-1115

126 Klitgord, N. and Segrè, D. (2010) Environments that induce synthetic microbial ecosystems.
PLoS computational biology 6, e1001002

127 Gardner, A., *et al.* (2004) Bacteriocins, spite and virulence. *Proceedings. Biological
sciences / The Royal Society* 271, 1529-1535

128 Maynard Smith, J. (1982) Evolution and the Theory of Games.

129 Scholz, R.L. and Greenberg, E.P. (2015) Sociality in *Escherichia coli*: Enterochelin Is a
Private Good at Low Cell Density and Can Be Shared at High Cell Density. *J Bacteriol* 197,
2122-2128

130 Griffin, A.S., *et al.* (2004) Cooperation and competition in pathogenic bacteria. *Nature* 430,
1024-1027

131 Romero, D., *et al.* (2011) An accessory protein required for anchoring and assembly of
amyloid fibres in *B. subtilis* biofilms. *Mol Microbiol* 80, 1155-1168

132 Whitchurch, C.B., *et al.* (2002) Extracellular DNA required for bacterial biofilm formation.
Science 295, 1487-1487

133 Kotte, O., *et al.* (2014) Phenotypic bistability in *Escherichia coli*'s central carbon
metabolism. *Molecular Systems Biology* 10, 736

134 Mowat, E., *et al.* (2010) *Pseudomonas aeruginosa* and their small diffusible extracellular
molecules inhibit *Aspergillus fumigatus* biofilm formation. *Fems Microbiol Lett* 313, 96-102

135 Jiang, P., *et al.* (2011) Antibiofilm activity of an exopolysaccharide from marine bacterium
Vibrio sp. QY101. *PloS one* 6, e18514

136 Dong, Y.H., *et al.* (2002) Identification of quorum-quenching N-acyl homoserine lactonases
from *Bacillus* species. *Applied and Environmental Microbiology* 68, 1754-1759

Outstanding Questions

- What is the effect of DNA uptake on fitness?
- How does the environment dictate the prevalence of competition?
- What determines the ability of a strain to resist invasion?
- Is competition always a temporary state or do constant battlefields exist? How stable are different outcomes (Figure 3D-F)?
- Is it possible to manipulate competition by altering environmental conditions?
- How aggressive are secondary metabolites commonly found in genomic data?
- How variable is the expression of competitive phenotypes within a population of clonal cells, and how does this heterogeneity affect the success of genotypes?

Figure 1

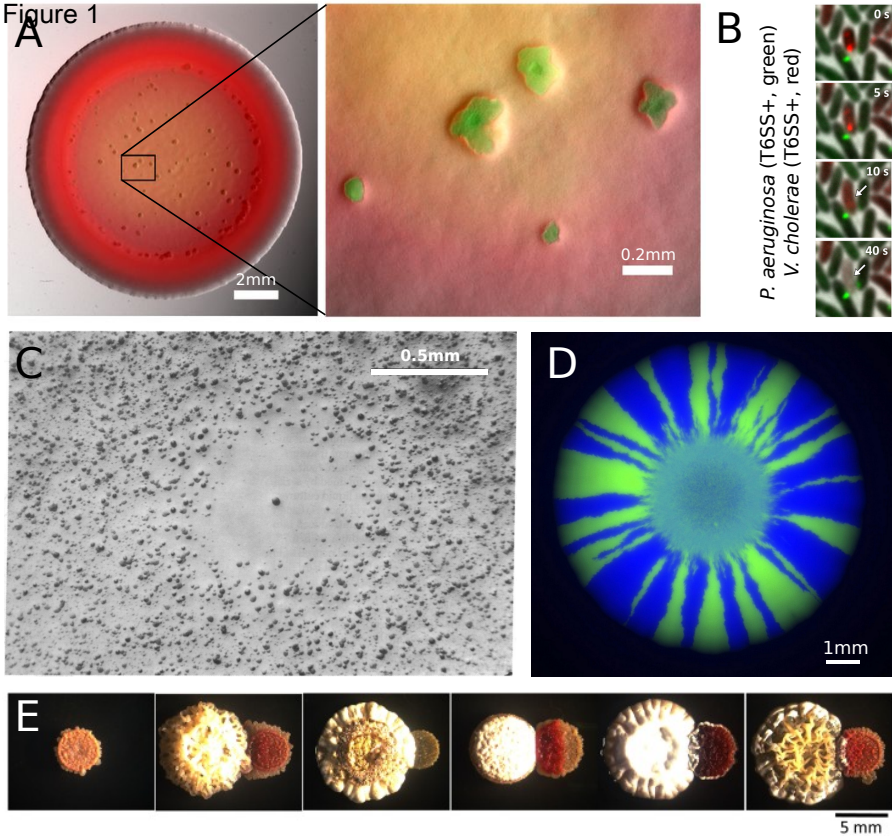
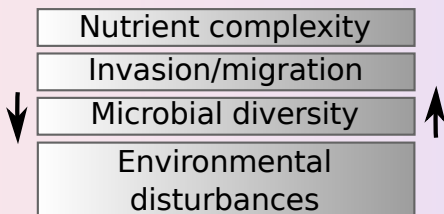
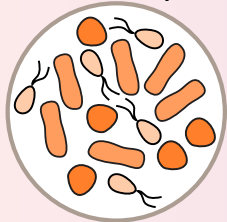


Figure 2

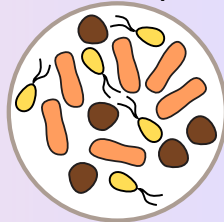
High selection
for competition

Low selection
for competition

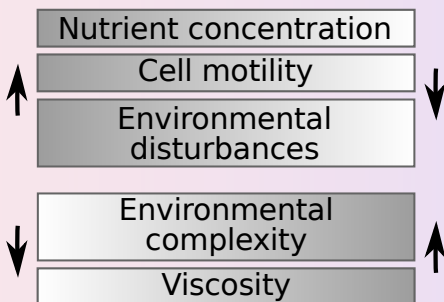
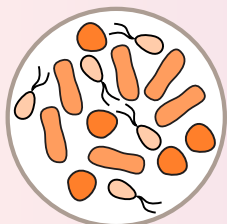
High metabolic
overlap



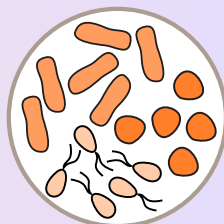
Low metabolic
overlap



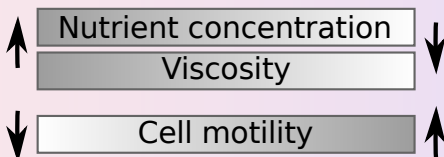
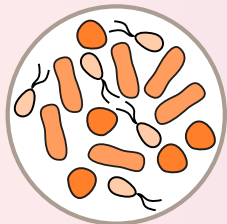
Mixed



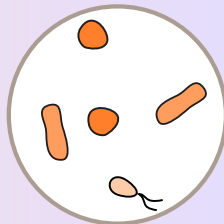
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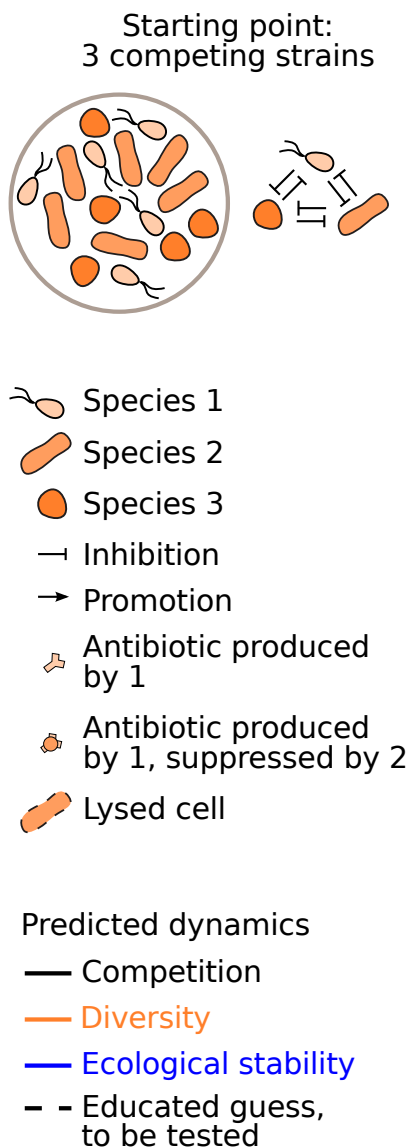
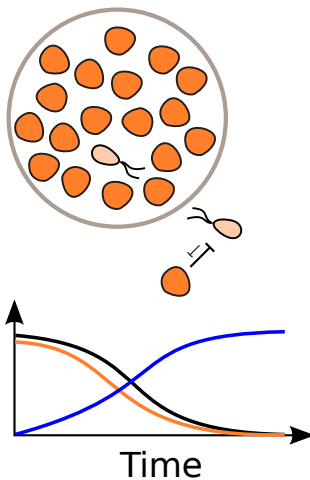
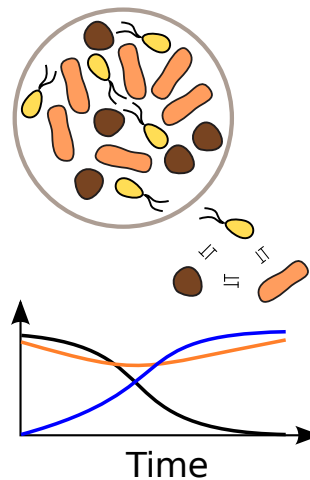
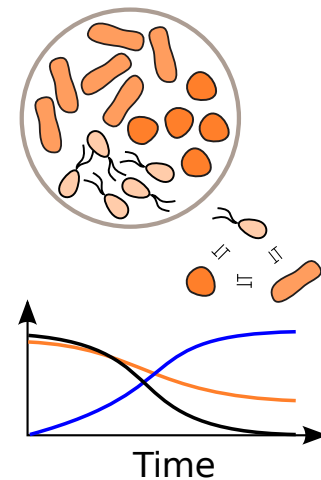
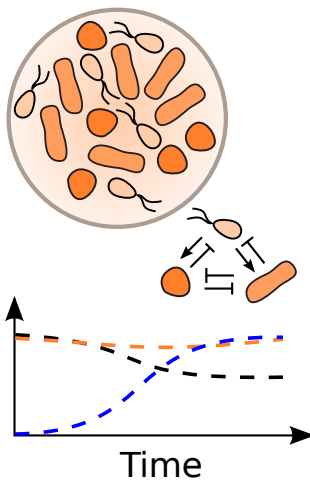
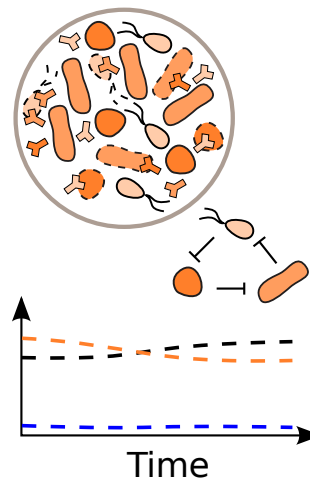


High cell density



Low cell density



**A** Competitive exclusion**B** Niche partitioning (resources)**C** Niche partitioning (space)**D** Exploitation of secretions**E** Continued aggression**F** Counteracting competition