# Personal Science Guide to the Microbiome

Richard Sprague

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## 1 Intro

#### ! Important

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Science is curiosity, a genuine and humble search for truth using a never-ending process of systematic experimentation. It's open to everyone and can be applied to any situation, including situations that affect you right now. It's *Personal Science* when you use the scientific method to discover important insights about the wellness and performance of yourself and those around you.

This book will introduce you to one exciting area of personal science: understanding your own microbiome. It's based on my own experiences collecting and studying hundreds of my own samples, and thousands from other people.

# Part I General Overview

# 2 Getting Started

The term "personal science" was first popularized by the late Seth Roberts, an Emeritus Professor in the Psychology at University of California, Berkeley. His best-selling book<sup>1</sup> and popular blog<sup>2</sup> insisted that much of modern science is too complicated for its own good, that interesting and practical results are often best achieved through personal experimentation. Through multiple examples from his own self-experiments, he used his own data to show non-obvious treatments for better sleep (skip breakfast), lower depression (faces in the morning), and many other situations.<sup>3</sup>

Most of the examples in this book are based on over 600 near-daily samples I took of my own microbiome over a three year period. Inspired by an experiment conducted at MIT<sup>4</sup>, during most of that time I also carefully tracked the food I ate, my sleep, and other variables like activity and location. Most of my near-daily samples were of my gut, but I also regularly tested my skin, nose, and mouth. Since I'm generally healthy, I didn't have a specific goal in mind other than to try to understand better what these microbes are doing, so many of my tests were taken while undergoing simple experiments, like eating a specific type of food or traveling to a new place. While not necessarily up to the rigorous standards of a formal scientific trial, these "n of 1" studies on myself helped me discover several new interesting facts about my own microbiome, many of which appear to contradict other published studies. In addition, hundreds of people sent me their own test results, letting me compare many different microbiomes. And of course, I also followed the latest developments in scientific publications and the general press as I eagerly tried to learn more.

This book tells you what I learned – and how you can learn too.

<sup>&</sup>lt;sup>1</sup>(S. D. Roberts 2007)

 $<sup>^2\</sup>mathrm{His}$  blog, active until his death in 2014, is actively discussed on a Facebook Community:  $\mathrm{https://sethroberts.net/2016/01/13/seth-roberts-community-on-facebook/}$ 

<sup>&</sup>lt;sup>3</sup>S. Roberts (2004)

<sup>&</sup>lt;sup>4</sup>(David, Materna, et al. 2014)

### 3 What is Personal Science?

Although the techniques of science are useful in all aspects of life, many people are attracted to Personal Science out of concern over a personal health issue.

Most of us grow up believing in *experts*. Whether it's a proclamation from the government, a highly-regarded book, a credentialed doctor, or an experienced family member, it only makes sense to rely on others who have spent more time with the situation than you have, or who have gained a reputation for reliably solving similar problems.

But what happens when experts disagree? Of course, you can simply choose to believe one or another based on some reasonable criteria, like their track record with treating problems like yours.

Unfortunately, many people find themselves suffering from a chronic condition for which expert advice seems to fail. One doctor says "do this" and another says the exact opposite. One treatment seems to work for while and then it no longer does. Sometimes the symptoms seem to disappear at random, despite undergoing no treatment at all. Five doctors give six different suggestions.

#### 3.1 How to Begin

If you suffer from a chronic condition, one of your first struggles is simply how bad is it? What is the precise version or name of this disease? What makes you different from a healthy person, or from the healthy person you used to be? Are there other people with the same condition, and if so, how does your situation compare to theirs? Are you getting better or worse?

In other words, you want to know the *context*. The first step in any treatment plan requires that you understand how you compare...to healthy people, to those who have the same condition as you do, to people who have partially or fully recovered. Are you improving or deteriorating?

Even symptom tracking is just one aspect of the question of context. I want to know more precisely the conditions under which my problem gets better or worse. In other words, what is the *context*? (e.g. are my migraines triggered by high altitudes, by caffeine, by stress, by something else? All of these are just other ways of saying "context").

One simple example: what's the best way to treat a headache? There's no good answer to that question unless you understand something about the context surrounding the person involved. The appropriate response will depend on whether he or she:

- gets headaches all the time.
- rarely gets headaches.
- drank heavily the night before.
- recently ate raw seafood from a street vendor.
- Underwent a course of antibiotics for a tick bite last summer and seemed to get better until now.

We know intuitively that each medical situation depends on the circumstances. Doctors are helpful partly because they've seen so many other cases that they can quickly focus attention on the aspects that are important to a specific individual. In other words, doctors are trained to recognize the full *context*, to see how this situation compares to others.

#### 3.2 Reference Values

Much of our understanding of context is driven by reference values. A doctor knows whether your cholesterol is high or low based on large population studies of other people. Every health study is essentially just a way to calculate reference values: of the n people exposed to this treatment, some fraction will improve. If that fraction is large enough, we say the treatment works. If not, the treatment doesn't work.

So the real question in any medical condition is: what is the reference value? What is the standard by which I am judging my current condition?

For many (most) situations, the reference values have been pre-computed based the medical community's long experience treating patients like you. We know that X% of people with your type of cancer respond well to this drug. We know that Y% of people who smoke develop this disease. And on and on.

But for some situations – like data from microbiome tests – there is no reference value. No-body knows what a "healthy" microbiome looks like. We need more data before we can say definitively that such-and-such abundance levels are "healthy" or "unhealthy".

In other cases, there are reference values for the general population, but not necessarily for you. The average height of a 3-year-old girl, for example, is based on data from umpteen thousands of 3-year-olds, but what about among 3-year-olds of your ethnic group, or your family, or people of your socio-economic class, or those in your neighborhood? Whether to consider your 3-year-old for special treatment depends entirely on which reference group you are using.

How can we get those reference values?

In other cases, a treatment may be too new, or too crazy, for there to be reference values. A terminal cancer patient who tries an experimental treatment, for example, is living in a world of unknown reference values. Importantly, after they try the treatment, they become one of

the reference values. And that's great! we now have a reference value for that treatment — but only if somebody bothers to record it. Often that data simply falls on the floor with nobody to catch it.

#### 3.3 Quantifying the anecdotal

If the results of a treatment are not recorded, we still have reference values. People still rely on word of mouth — anecdotes — when looking for new treatments. But those reference values are anecdotal. You regularly hear stories of the form "I tried X and it worked for me". Hear enough of those stories and you may want to try it yourself. But how many of those stories constitutes "enough" to try for yourself?

What if there were a common way for everyone who tries X to record their results quantitatively?

That's the idea behind symptom tracking, and it's a nice start. Some companies try to add fancy additional features on top, like using machine learning to try to guess better than you can alone about the various correlations found within your data. Many companies go this direction — gather enough data, either from yourself or from others, so that we can predict the causes for various states. Again, that's interesting and it's a nice start, but it's limited.

What you really want — and the key, original idea behind Personal Science — is to let you take that quantitative data and *compare* it to others: others like you, people who you consider to be just like you except for such-and-such symptom.

Now, in some cases, a symptom tracking or quantified self product will let you see yourself compared to an aggregated summary of all other users. Fitbit might let you compare yourself to all those of your sex or age, for example, or maybe those in your geography. This is a good start.

But what if you could choose your own subset of users with whom you want to compare yourself? Because only *you* know which type of person you identify with, or to which type of health condition you want to belong, Personal Science lets you analyze and study the data as a whole.

That's why it's *personal* – it's about the one, unique data point that is you – and why it's *science* – democratize the quantitative tools of science to let you understand your condition, for yourself.

# Part II

# Science

# 4 Biology basics

With all this complexity, how do you begin to study the abundance of life around us? And then, how do we apply what we know about the zillions of organisms *around* us, to how they relate to what's *inside* us?

Like life itself, biology is a very broad field. Fortunately, despite the incredible variations, scientists have discovered a few simple traits and rules that apply to every life form. For the special life form *homo sapiens*, we have also learned a number of simplifications that will let us talk in more detail later.

#### 4.0.1 The Basics

The study of biology starts with the cell, those tiny self-contained blocks that are the very definition of life. From the most humble microbe to the biggest animal, every living thing is made of these structures, which are really just miniature chemical reactors that pull external molecules from their environment and reassemble them in ways that perpetuate the reaction.

Everything in the universe tends over time to fall into disorganized entropy, but cells contain many tricks, honed over billions of years of evolution, to thrive. Despite the diversity of life, a surprising number of those tricks are shared by all cells: a wall to protect and allow exchanges with the outside world, a means of storing information through DNA, and of course a process of reproduction.

The biggest technical difference among cells is not size or even function, but rather the distinction between two broad categories: eukaryotes, which are the cells of everything from corn plants to humans to fungi and amoebas, and prokaryotes, which are always single-celled bacteria and other microbes. It's interesting enough that all life could be characterized into these distinct groups, but if you look at the DNA that defines each cell, you will find some other odd differences that hint at more refined relationships among living things.

A cell's DNA contains all the information needed to create another copy of itself; even the instructions for how to do the copying are just a sequence of predictable DNA letters written somewhere in the genetic code of all cells. This very important copying function is performed by a ribosome, which is a complicated but well-studied part of every living thing. Because the ribosome has such a fundamental function, it tends not to fall prey to many mutations over time; after all, a single DNA letter change in the ribosome is almost always fatal to the entire cell. But every so often — maybe every few million years — there is a mutation in some part

of the ribosome, and this leads us to a clever way to understand better how living things are related to one another.

Humans and monkeys, for example, may differ in many different parts of their DNA, but their ribosomes are nearly identical. In fact, the ribosomes of all mammals and even all vertebrates are virtually the same. Well, there are some differences, but interestingly the differences between large, obvious groupings like vertebrates or invertebrates are much more significant than the differences between different vertebrates, or between mammals or other creatures.

In fact we can even quantify the differences, and scientists over the years have done exactly that. The ribosomes of humans and monkeys, for example, *are* different in only 10 places — practically nothing in a molecule that consists of a few thousand nucleotides connecting dozens of proteins. Similarly, the ribosomes of vertebrates and invertebrates are different in perhaps 100 places – clearly much more significant than the differences within each grouping, but still not terribly different relative to the entire ribosome.

The ribosomes of prokaryotes and eukaryotes, on the other hand, can be quite different: perhaps 1000 places (to continue this very-rough-but-sort-of-useful metric). The point is that even at the molecular, ribosome level, we can see obvious genetic differences even if the physical differences between two organisms aren't necessarily obvious at first glance. A one-celled eurkaryote, like an amoeba or algae, for example, might seem like it should share something in common with a one-celled prokaryote, but looks are entirely deceiving: nobody looking just at the ribosome could possible mistake these as similar.

Now, scientists have mapped the differences in ribosomal structure among nearly all living things and this general rule always applies: the groupings of life forms are directly related to the similarities or differences in their ribosomes.

Meanwhile, scientists have made estimates of how long it takes, given various assumptions, for a series of step-by-step mutations to result in a differently-sized ribosome. In other words, using some basic chemistry that is easily demonstrated experimentally in a lab, we can offer some reasonable guesses for the number of generations it would take for a given level of random mutations to result in the differently-sized ribosomes we see in nature. Add it all up, and behold: you can see a reasonable fit with the clues we have in the fossil record and the geological record for the same creatures.

None of this is perfect, of course, but the point is that we have a crude way to quantify how different one organism is from another and, if you like, we can guess how long it would take for a single common ancestor to accumulate enough random mutations to account for the differences between any two life forms.

So far so good. Next let's imagine we have a circle, where a single cell begins in the middle, divides into two cells, and those cells divide, etc. for zillions of years until there are clear ribosomal differences between each line. Let's call this a family tree and take all known life forms and spread them into this circle.

If you do that, you'll find that the number of mutations necessary to generate all the variation found in eukaryotes – everything from corn plants to people – would take up only a tiny sliver of that circle. The rest of life — in particular the microbial life of prokaryotes – is so unimaginably diverse, that a space alien looking at earth's lifeforms could well conclude that the differences between humans and corn plants aren't significant enough to worry about.

That's how complicated the world of bacteria can be.

#### 4.0.2 Taxonomy

How do you talk about the relationships between various different life forms?

A taxon is a simple unit of life. A *homo sapiens* is a taxon, but so is a primate. A mammal is a taxon too. It might seem odd in the ordinary biological world to bother using the same term 'taxon' to refer to all of those units, but for bacteria and anything that reproduces asexually, it's an important distinction because often, taxonomists don't agree about whether a group of organisms is part of the same taxon or not.

Since Carl Linnaeus in the 1700's, the science of taxonomy divides all life into seven major categories: Kingdom, Phylum, Class, Order, Family, Genus, Species (which I was taught in sixth grade to remember by the mnemonic "King Philip Came Over for Girl Scouts").

Bacteria make up their own kingdom. Just as the animal kingdom includes everything from humans to jellyfish to beetles, the diversity of bacterial life is enormous, a point which can't be emphasized too much. This is true at every rank in the taxonomy. Even two organisms that are the same at a lower rank, like genus, might have radically different affects on the human body, just as a member of the animal genus Canis could be anything from a wolf or coyote to a Chihuahua.

You cannot mix and match these ranks. If you know something about the number of organisms in one genus, for example, this is meaningful only in comparison to the numbers of another genus. Keep that in mind during our analysis.

#### 4.0.3 Microbiology

Before we get to the nuts and bolts of analyzing the microbiome, it's helpful to review a few basics of microbiology.

This section explains more about cells, but now from a chemical point of view. It's through identifying these chemicals that we are able to understand how the entire system works. Chemists and biologists have developed many brilliant techniques for identifying these processes, nearly all of which take place at microscopic levels. How we are able to tell what's happening is a subject worthy of its own book, but here we will concern ourselves with understanding how

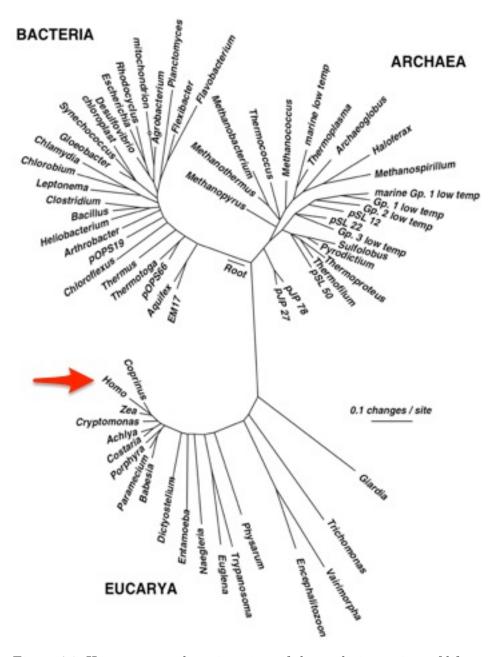


Figure 4.1: Humans are only a tiny piece of the explosive variety of life.

we are able to convert the happenings in the physical world of the cell, to the software world, where we can do the analysis.

#### A few questions to answer:

- How do we see things at such a tiny scale? How can we be confident that what we see is real?
- How does Next Generation Sequencing work?
- What is a gene, how it creates proteins, and why that matters
- what is a SNP?

Think of cells as self-contained factories that accept tiny chemical raw materials from the outside, process them, and then output byproducts. There is a whole, well-developed chemical explanation for this which we won't detail, but this long chain of inputs and outputs, carried from cell to cell, is key to the working of every living thing, including humans. The various chemicals passed from cell to cell carry raw materials needed for life, but they also carry information that tells other cells what to do.

All life runs on three chemical building blocks: DNA, RNA, and proteins. Each of these is an arbitrarily-long chain of repeating molecules called *nucleotides* (DNA or RNA) and *amino acids* (proteins). Due to constraints on the way atoms interact, the set of building blocks is fixed. All DNA is composed of only four nucleotides: adenine, thymine, guanine, and cytosine, represented by the letters A, T, G, and C. RNA is composed of the same molecules, except that uracile (U) is substituted for thymine.

Similarly, proteins are constructed with only 20 different amino acids, which can again be represented by a short three-character abbreviation.

The correspondence between these different proteins and combinations of DNA or RNA is referred to as the genetic code.

As a programmer looking through all of this, you may immediately be inspired to write your own software version of this. After all, the remarkable consistency between all of these building blocks cries out for manipulation by computer.

In fact, that's exactly what bioinformaticians do, and numerous software packages have been developed to make it easy to treat these building blocks of life like ordinary computer strings.

Perhaps the biggest challenge is the volume of data to be handled, which can easily be measured in gigabytes for a simple organism, but can require entire server farms in the case of some real-world biological systems. For that reason, much of bioinformatics is about optimizations to improve the speed of processing a large data set, or to simply the presentation in a way that can reveal the most biologically interesting aspects of a problem without wading in over-complexity.

One special protein, DNA, can store information.

# 5 Microbes everywhere

Living microbes are found everywhere on earth, often in surprising places. This section looks at some examples of how ubiquitous and hardy they can be, both in nature and on our bodies. We'll also discuss the technologies used to study the human microbiome.

The most important parts of our world are invisible. We can't see air, but we can't live without it. Similarly, our bodies are literally bathed in living, eating, reproducing lifeforms that we can't see but that have profound effects on all that we do.

Life is tenacious, finding its niche, fighting for it, and stubbornly holding on in every environment it encounters. Living organisms inhabit the sky, deep underground, in the most barren habitats cold or hot anywhere on earth. The vast majority of these are microbes, so small we can't see them, but small doesn't mean irrelevant. In fact, the more that science understands about the invisible microbial world, the more it becomes clear that these uncountably numerous creatures exert a much bigger effect than we think.

Every traditional culture recognizes a role for the invisible, often translated with words like "spirit" or "life force", sometimes with more expressive terms like "angels", "demons", "gods" or even, simply, "God". It's tempting to dismiss these invisible forces as so much superstition, as though truth is made only of things we can see, but of course that's not quite true either. With the right instruments, we can see many invisible things; some of the greatest discoveries happen when a new gadget like a microscope or telescope makes people aware of a world that was previously hidden.

The invisible world of microbes is like that, with new, low-cost technologies showing us an incredible, rich, living universes of over 1 trillion species<sup>1</sup> waiting to be explored.

The word "microbe" refers to any tiny organism that carries its own genetic information for purposes of propagating itself. Far too small to see with the naked eye, dozens could fit inside a typical human cell. Although it's common to think of microbes synonymously with bacteria, in fact there are at least seven different types of microorganism:

- bacteria
- archaea: extremophile life forms that live and thrive in environments too challenging for bacteria
- protozoa
- algae

<sup>&</sup>lt;sup>1</sup>Nobody knows for sure, but perhaps the latest, best estimate is Locey and Lennon (2016)

- fungi
- viruses
- a few multi-cellular animal parasites such as helminths.

Each of these has its own characteristic body type, means of reproduction, ways of moving around, and a deep, long history that is far older than humans.

Let's look next at some of these environments and see the odd places where microbes have been found.

#### 5.1 Microbes above and below

Scientists studying a water-filled fracture two miles underground at the Mponeng gold mine near Johannesburg, South Africa, discovered Candidatus Desulforudis audaxviator by accident, after noticing odd levels of hydrogen compounds, by-products of the activity of an isolated bacterial colony.<sup>2</sup> Interestingly, this organism is a member of the same Firmicutes phylum that dominates human guts, though this particular bacterium evolved quite separately from us: it hasn't been exposed to surface water for millions of years. A systematic study of its genome revealed that, unlike other bacteria that usually live in co-dependent colonies, this one can survive all by itself, feeding on tiny bits of radioactive energy from uranium decay in an environment far removed from all other energy sources. It's not a great life: these creatures reproduce rarely, only once every few hundred or thousand years. But at least they don't have to worry about being consumed by predators down there.

Subglacial Lake Whillans is a lake buried under more than 800 meters of ice in the West Antarctic. A careful underground bore hole inserted by a team from Louisiana State University in 2014 found almost 4,000 different kinds of bacteria and archaea surviving under that ice.<sup>3</sup> The total bacterial count was not that different from what you'd find in surface lakes on other parts of the planet, a fact that is especially surprising for an environment that hasn't had a ray of light in millions of years. The bacteria instead thrive on iron, sulphur, and nitrogen as energy sources.<sup>4</sup>

Those may not be the deepest examples. A Cold War-era Soviet team drilling the world's deepest hole, were forced to abandon the project in 1994 at 12,261 meters (or 7.5 miles) underground, when they hit temperatures above 180 °C (or 356 °F), too hot for their equipment. Apparently the conditions weren't too hot for life, though: the nine-inch diameter Kola Superdeep Borehole <sup>5</sup> found 24 species of fossilized plankton among the two-billion-year-old rocks down there. Of course, fossils are not the same thing as living microbes, but even dead remnants at that depth is evidence of the tenacity of life.

<sup>&</sup>lt;sup>2</sup>See Chivian et al. (2008)

 $<sup>^3{\</sup>rm the}$  WISSARD Science Team et al. (2014)

<sup>&</sup>lt;sup>4</sup>http://earthsky.org/earth/diverse-microbes-found-deep-beneath-antarctic-ice-sheet

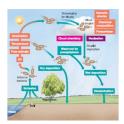
<sup>&</sup>lt;sup>5</sup>http://www.atlasobscura.com/places/kola-superdeep-borehole



Figure 5.1: Go another 2,600 feet to find microbes. Photo: NASA/JPL-Caltech

Closer to the surface, a 2015 Chinese study<sup>6</sup> showed that 32% of the variety in an ecosystem is associated with variation in the life below ground, mostly bacteria that sustain the ability of roots to take nutrients out of the soil. Just knowing the temperature or precipitation levels of an environment won't tell you about the plants likely to be found there – the microbes matter too.

Even the sky contains living microbes. Scientists at the Institut de Chimie de Clermont-Ferrand in France have for decades sampled clouds to determine their precise contents, and sure enough: they find plenty of life there, usually between 1,000 and 10,000 bacterial cells per milliliter — not all that different from the amount you'd find in alpine snow. Like every living organism, these cells must soak up water and other nutrients, converting them into energy and various by-products, which collectively have a massive effect on the overall atmosphere, more than enough to affect climate. <sup>7</sup>



source: ASMScience

The upper atmosphere is a harsh place for life: regular freezing and thawing, constant bombardment of UV radiation from the sun during the day, cold, subzero freezing temperatures at night, high speed, unpredictable winds that quickly disperse any colonies. Plus, at any moment these organisms can find themselves flushed to the ground in a rainstorm, where they'll need to adapt again.

These extreme conditions are just another day in the life for one species commonly found in clouds, *Pseudomonas syringae*, which harbors a protein in its cellular wall that reacts to cold temperatures, alternately preventing and allowing a water molecule to turn into ice and

<sup>&</sup>lt;sup>6</sup>Jing et al. (2015) and a summary here: https://macroecology.ku.dk/media/news\_list/2015/09\_biodiversity-belowground-is-just-as-important-as-aboveground/

<sup>&</sup>lt;sup>7</sup>http://www.asmscience.org/content/journal/microbe/10.1128/microbe.7.119.1

back. It doesn't take many of these reactions to generate precipitation. With so many cells constantly floating in the atmosphere, even small changes in concentration — perhaps due to human activity on the ground — can, at least theoretically, make the difference between rainfall and drought. How much of an effect is hard to say: you can imagine how difficult it is to study bacteria floating in the sky.

Our inability to access these environments is often the biggest reason we remain ignorant of the life that is found there, but there have been many attempts to learn more. Formal studies about the viability of microbes in space have been conducted since the early 1960s <sup>8</sup>, when Apollo-era scientists wanted to understand the dangers of space travel, both to any humans in space as well as to those of us on the ground who might be exposed to any intersteller visitors.

Although new and bizarre extremophiles are discovered regularly, so far it appears that even the hardiest of known organisms have a tough time when directly exposed to solar ultraviolet radiation. But the particularly resilient spore-making *Bacillus subtilis*, for example, it is estimated could survive for at least six years if it were shielded somehow from direct sunlight, say embedded inside a meteorite.<sup>9</sup>

Several lichen species, including rock colonizing *Rhizocarpon geographicum* and *Xanthoria elegans*, and the vagrant *Aspicilia fruticulosa*, remained alive after ten days of direct UV exposure on board a European Space Agency spacecraft. <sup>10</sup> Some especially hardy cyanobacteria that came with the lichens didn't survive, so perhaps space offers a better chance for multicellular life, which has the luxury of outer protective pigmented layers.



Figure 5.2: Could be lichen outer space. Photo: J Brew

Traces of sea plankton, for example, have been found in space, on the surface of the International Space Station, where they are believed to have floated from the upper atmosphere. <sup>11</sup> Why?! How did they get there! Who knows!

<sup>&</sup>lt;sup>8</sup>Hotchin et al. (1967)

<sup>&</sup>lt;sup>9</sup>See an extensive 2010 review of everything known about space microbes in Horneck, Klaus, and Mancinelli (2010). Or skip to the handy summary table

 $<sup>^{10}</sup>$ Torre et al. (2010)

<sup>&</sup>lt;sup>11</sup>http://tass.ru/en/non-political/745635

What is known is that between a quarter and two-thirds of microbes in the air are entirely new and undiscovered organisms. A study of the "air microbiome" above New York City found bacteria and viruses that apparently originated in water, soil, vegetation, as well as in animals and humans, but even then few patterns emerge. Although there appear to be distinct microbial environments, on the land versus water, for example, overall many of these organisms are quite hardy and seem to find themselves migrating all over the place.

They can migrate in the smoke from a wildfire. A 2008 study by University of Idaho scientists<sup>12</sup> identified a dozen microbes that are transported in plumes of smoke, despite temperatures of  $250^{\circ}$  C or more. The new science of *Pyroaerobiology* is uncovering many examples where smoke-transported microbes have an impact on forest health and more.

Still other microbes thrive in radioactive environments, like the dangerous interior of a nuclear reactor. *Deinococcus radiodurans* is an extremophile member of Phylum Deinococcus-Thermus that boasts an impressive built-in DNA repair mechanism that lets it survive cold, vacuum, acid, light, dehydration – you name it. It remains unbothered by radiation levels more than 1,000 times higher than would kill a human.

Microbes seem capable of living off just about anything. *Ideonella sakaiensis*, discovered in 2016 by a Japanese team<sup>13</sup>, can break down and metabolize plastic, just like the fungus *Aspergillus tubingensis*, found in 2018 in a garbage dump in Pakistan, which eats polyurethene in months rather than decades.<sup>14</sup> The waxworm *Plodia interpunctella*, observed eating plastic in a lab probably owes its digestive abilities to other, as-yet-to-be-studied microbes.

In fact, many non-microbial organisms owe their most defining characteristics to microbes. Termites wood-eating abilities are thanks to a whole community of synergistic bacteria, archaea, and protists. Aphids can't live off sap without *Buchnera*, a microbe that supplies them with essential amino acids. Some microbes even play a role in the mineralization of copper and gold.<sup>15</sup>



#### 5.2 Microbes around you

You don't have to go to extreme conditions to find unusual microbes. Microbes thrive whereever humans live, and they are in our everyday environment too. The PathoMap Project,

 $<sup>^{12}</sup>$ Kobziar et al. (2018)

 $<sup>^{13} \</sup>rm http://www.sci-news.com/biology/ideonella-sakaiensis-bacterium-can-break-down-metabolize-plastic-03693.html$ 

<sup>&</sup>lt;sup>14</sup>Khan et al. (2017)

 $<sup>^{15}</sup>$ Bütof et al. (2018)

studying DNA collected from the New York City area found that, like the air above, half of the microbes we walk past everyday are unknown to science. <sup>16</sup> Most of the organisms are apparently benign, with no obvious affect on humans one way or another. Even when known pathogens are found, including *Yersinia pestis* (Bubonic plague) and *Bacillus anthracis* (anthrax), the lack of reported infections indicates that probably these organisms are busying themselves for some other, unknown, and maybe even useful purpose<sup>17</sup>

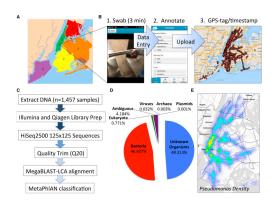


Figure 5.3: Half of the organisms collected by the Pathomap study are unknown. Source: Afshinnekoo et al. (2015)

Generally the microbes seem content to exist patiently with no apparent affect on the environment. A station flooded by Hurricane Sandy showed a similarity to a marine environment a year after the disaster.

Humans are the source of many unusual microbes in our environment. Regularly shedding 1.5 million skin cells per hour, your body's leftover inhabitants can colonize a hotel room in less than six hours.<sup>18</sup>

Your household pets carry microbes, of course, but simply having a pet seems associated with different microbes in humans. One study showed that babies living in a household with pets have more Clostridiaceae, Veillonella (especially for dogs), Peptostreptococcaceae and Coprococcus. Cats in particular seemed associated with lower Bifidobacterium while dogs seemed to spell doom for Eqgerthella.

<sup>&</sup>lt;sup>16</sup>Afshinnekoo et al. (2015)

 $<sup>^{17}\</sup>mathrm{A}$  later, more careful analysis indicates these particular pathogens may not actually be present: http://msystems.asm.org/content/msys/1/3/e00050-16.full.pdf

<sup>&</sup>lt;sup>18</sup>http://www.wsj.com/articles/big-data-and-bacteria-mapping-the-new-york-subways-dna-1423159629

 $<sup>^{19}</sup>$ Azad et al. (2013)

# 6 Microbes and you

#### 6.1 The promise and disappointment of genetic testing

If you want to optimize your health, you'll eventually need to understand more about your genes. Wearable devices like FitBit or Apple Watch, or a nutrition or dieting app like MyFitnessPal, can help optimize some aspects of your physical body but hard work and discipline will take you only so far. As you reach the limits of how much you can change, you'll settle into the discovery that the genetic component is undeniable. Over one million customers of the genetic testing company 23andme have opted to look at their genes in part to understand better what their own limits are.

Genes do seem important. Everything from twin studies to laboratory experiments with knock-out mice shows that large parts — perhaps the major part — of our health and even behaviors are determined as much by our genetic makeup as by the environment in which we put ourselves.

Still, despite much progress since the unveiling of the Human Genome Project in 2001, there are frustratingly few examples of genes that decisively determine one trait or another. Except for a few simple cases like eye or hair color, most genes seem merely to increase or decrease the odds one way or another. When you read the details about your own genes, you'll be disappointed at how little about genetic testing is truly insightful. Did you really need a DNA test to tell you that you are lactose intolerant?

Worse, even when the science tells you something you didn't know — your likelihood of Alzheimers or Grave's disease — there often isn't much you can do about it besides eat healthy and get plenty of exercise. In fact, with disappointingly few exceptions, nearly all conclusions you'll get with DNA results will be advice you should be doing anyway.

What's an optimizer to do? On the one hand, the evidence is powerful that genes determine much or most of your health, but on the other hand, you can't do much about it beyond the obvious. The results of human DNA testing just aren't all that actionable.

Fortunately, one of the most exciting consequences of the latest science on human genetics is the role played by other genes in your body. And the best news: you can change them! And you don't need a fancy laboratory with complicated equipment for recombinant DNA. This book will show you how, through experiments on the types of food you eat and deliberate changes you can make in your environment, you can make a significant difference in kinds and functions of the genes inside you.

#### 6.2 Most of your DNA is not fixed

If you could zap me with a scanner that can break down everything in my body, all the physical "hardware" inside me right now, you'd find a curious fact: although it's true that 99% of the weight and size of what you see is human (blood, skin, bones, organs, etc.), only about half of the *cells* are human, and even less than that — perhaps as little as 1% — of the DNA-carrying genes are human.

What's the rest? Who am I, if only 1% of the genes inside me are human? The answer is microbes, and as befits something that so outnumbers the "human" part of us, they play a large role in everything about what we do, from our health to our moods and even to our motivations. To put this more precisely, humans have 20,000 - 25,000 genes, but just the microbes in your intestines alone have an estimated 2 to 4 million genes.

These microbes and the important DNA they carry are constantly changing, sometimes quite significantly, depending on what you eat, who you're with, and a host of other factors that you can manipulate.

#### 6.3 Microbes are older than any of us

We tend to think of the invisible, single-celled microbes as "primitive", not nearly as "advanced" as we humans, with our marvelous brains and ability to transform the earth with airplanes and skyscrapers and nuclear reactors and all the rest. But that's what we would think, wouldn't we? In fact, the microbes are everywhere, literally everywhere on earth, in the sky, even deep underground. We can't go anywhere without encountering microbes because, well, there are even microbes on and inside us. Humans can't survive without microbes. So what does it even mean to say we're "better" or more "advanced" than they are?

Before the microscope, people didn't even know that microbes existed. Similarly, until the advent of large-scale gene sequencing machines in the past ten years, almost nothing was known about the amazing ubiquity and resilience of microbes. Yes, they're single-celled and yes many of their cellular functions seem more straightforward than the functions of a multicellular creature like us, but it would be a mistake to assume that means microbes – collectively – are less influential, and certainly it would be a big error to assume they are less important. Fact is, these organisms have been around, breathing, eating, multiplying, for billions of years, often in pretty much the same form that they are today. These things have survived every imaginable planetary condition from volcanoes to the depths of the ocean to the inside of nuclear reactors. Global Warming means nothing to these guys, who have seen and thrived all over the earth since the day life first appeared.

#### 6.4 What they want

Because they have such a huge advantage over us, in lifespan (each microbe is an exact divided copy of itself, going back a zillion generations), in speed of replication (they can double in just a few minutes under the right conditions), and ubiquity (as I said, cellwise they far outnumber us), they can afford to colonize every new imaginable environment.

And that's what they do, every time a new frontier opens to them. The moment of your birth, for example, when you left the (mostly) sterile conditions of your mother's womb, they immediately flooded all over your skin, mostly coming from your mother, and in that fresh environment they used their first-mover advantage to get a stronghold that in many cases lasts your entire life. Many (most?) of the microbes that matter arrived inside you this way, originally, and many of them are still there today, decades, even half a century or more later.

To survive, they need one thing: something to eat. Being so tiny, they don't need much, and they mostly eat things that you (and other larger creatures) weren't interested in anyway. (Or, since they were here first, it's probably more accurate to say that you and I must live on the foods that they don't want. A cheeseburger is only food for you because you snatch it faster than they do. Leave it outside for a while and they'll get it eventually).

#### 6.5 Who's in charge?

Collectively, the multitude species of microbes will eat just about everything, but individually each species has its preferences. When they're outside the body, as I said, they can "colonize" new territories (like fresh baby skin) to get what they want, but those inside your tummy are at the mercy of whatever it is you decide to put into your mouth.

Often, that's not a big deal: many species thrive on the same proteins, carbohydrates, and fats that you do. But some species do better than others with certain types of foods, and this is where the line between your human desires and theirs becomes unclear.

Eighty percent of all your brain's outside receptors – counting all the nerve endings everywhere on your skin – eighty percent complete their connections in the gut. The main switching grounds, an area called the vagus nerve, does *something*. What? We know very little, but we see some evidence that the purpose – the reason that not 1% or 10% or 50% but a full 80% of all the receptors go to the gut – is so the microbes can tell your brain what to do.

When you find yourself feeling hungry, ask yourself who is feeling hungry. Scientists have traced that feeling of hunger to changes in certain hormones like leptin, but wait – why did the leptin levels change in the first place? Could it be that a microbe someplace was manipulating your leptin levels, perhaps by poking that vagus nerve just the right way – to get your brain to start thinking about whatever food that microbe wants?

This isn't as ridiculous as it sounds, the idea that microbes could influence your feelings and desires. Think about a disease like the rabies. Because it spreads through saliva, it can't find new territory unless its host somehow finds itself exchanging saliva – biting – another potential host. So guess what a rabies victim can't stop thinking about? Biting a new victim. The microbe literally puts a thought into the mind.

There are many other examples, so many in fact as to be potentially a bit disturbing when we realize that we humans may be much more at the mercy of tiny microbes than we think. Links have been made between microbes and schizophrenia, stress, anxiety, self-grooming, and much more. Autism Spectral Disorders, which have always seemed puzzling because of the relationship they seem to have with digestive problems, are also linked to microbes, or the lack thereof.

Perhaps the most intriguing example is the common parasite *Toxoplasma gondii*, the strange organism that can only reproduce in the intestines of cats. A parasite seen often in all warmblooded mammals, it's found in about a third of the global population of humans too. It's one of the reasons they tell pregnant women to stay away from cat litter. But here's the interesting part: when a Toxo protozoa infects a mouse, it leaves cysts in the mouse brain that make it attracted to cat urine! Yes, it changes the neurology of a mouse so that it's more likely to end up inside a cat's tummy – exactly where it can reproduce.

Think about this too much, and you'll end up with the obvious question: what other weird microbes are infecting us right now? Can we explain some of our own behaviors this way? Is there a human equivalent of these infections, driving us to do things we "ordinarily" wouldn't do? And maybe these microbes are so ubiquitous, teeming all over us and in our brains, maybe there's no way to even know what "ordinary" or "normal" human behavior is.

#### 6.6 What is health?

Modern, western medicine tends to think reductively about health, dividing the body into pieces like organs and cells and prescribing interventions that target one particular aspect of the whole, with specific drugs or supplements. But of course nothing as complex as the body and health can be simplified this much. Maybe you can't really think about human hardware without thinking about the whole ecology that goes with it, the various organisms live in and around us and greatly outnumber us.

From this perspective, the whole idea of "health" takes on a new meaning, because we're no longer talking about the status of a single organism — me — but rather about the entire functioning ecosystem of many, many living things, including the "me" that I want to refer to as a human. You can't survive long without these microbes any more than you can survive without air. This whole "me", sometimes referred to as the "holobiont", is perhaps the true unit of what it means to be human and healthy.

Redefining health in terms of the holobiont has important implications for treatment. If it's the *entire* ecology in and around me, then targeting a single unit or a single symptom may not be the best solution. Treating a skin condition with an antimicrobial salve, for example, may inadvertently destroy other microbes necessary for some other function. Teeth-brushing or hair shampooing, while seemingly fundamental aspects of hygiene, may not be simply about "getting rid" of something that we think of as "bad", such as an unwanted odor. In your zeal to rid yourself of one thing (the odor) you may be introducing another (a skin condition someplace else). It might be better to treat the root cause, figure out why the odor is there in the first place.

But what is a "root" cause in a complex ecological system like our bodies? After all, anything that affects one part of the body is likely to affect others as well. Is there a way to affect everything all at once?

Diet is one way. What you eat is an input to the entire ecosystem.

Where you live – your environment – is another. From the air you breathe (is it clean? cold?) to the amount of stress you face, change your immediate surroundings and you will change the ecosystem.

If we no longer think of our bodies as independent parts, then our treatment options must be holistic. No intervention should be done without considering the consequences it has on the whole. Similarly, it may often (usually?) be true that the best treatments are dietary or environmental – facing the entire holobiont at once.

# 7 Microbes In You

#### 7.1 Microbes and health

The great French scientist Louis Pasteur, working as a physician in the 1800s, was the first to popularize the idea that the world is covered in *germs*, invisible agents that he associated with food spoilage and disease. Simple steps at hygiene (the word derives from a Greek phrase meaning "healthful art") could make conditions inhospitable for them, he discovered, enabling better food storage and dramatically fewer illnesses. Working as a chemistry professor in the 1850s, one of his students, the son of a local wine manufacturer, sought his help to solve problems with souring. Subsequent investigations led him to conclude that invisible yeasts were the culprit, and that exposure to air could affect the rate of fermentation. Pasteur's emphasis on controlling these microbes led to a general association of germs as pathogens, a bad, even evil force that we must destroy, every single time. The only good germ is a dead germ.

And for good reason. The development of effective disinfectants, and then antibiotics – germ killers – was one of the greatest medical achievements of all time, saving the lives of a significant fraction of the human race. Before Pasteur, urban life was a precarious game of chance against diseases that seemed to come and go randomly. Thanks to the development of the Germ Theory of Disease, it was suddenly possible to imagine a world where deadly illnesses and infections could be controlled and perhaps eliminated. Now, every day of your life, modern amenities like running water and flush toilets keep you healthy simply by controlling the growth of microbes.

Some can be quite nasty. The bacterium that causes Cholera, *Vibrio cholerae*, after infecting the small intestine, promptly hijacks the body's natural defense systems into sending a large stream of water through the colon to flush out all other bacteria. Normally, this would be an appropriate response to an invasion, but by hiding before the colon, *Vibrio cholerae* continues to breed above the main flow of water. The resulting diarrhea is so fierce that the patient is literally unable to drink enough to make up for the outflow, and dies of dehydration within days. And in a final act of cruelty, that water that the body pushes out so fiercely is itself full of *V. cholerae*, who use the opportunity to infect others who come in contact with the water.

Bacterial gastroenteritis – more commonly known as "food poisoning" – is a source of discomfort, abdominal pain, diarrhea, and worse for about 1.5 million Americans each year. Most of the time, it can be traced to *Campylobacter jejuni*, which has a shape and structure ideally

suited to penetrating the mucosal layer of your intestines, where it attaches itself and begins to release toxins that activate the immune system and the resulting diarrhea and fever. *C. jejuni* is a natural and benign colonizer of the digestive tracts of many bird species, including poultry, and because most of the time these birds appear perfectly healthy, it's not uncommon for 20% or more of retail chickens to be contaminated. Fewer than 1,000 organisms under the right conditions can cause illness.

Fortunately, C. jejuni is easy to kill. Low pH, for example: 2.3 and they're dead (think lemon juice or vinegar). The antibiotic erythromycin is quite effective too, with almost no resistance observed so far. But the best weapon is heat: they strongly prefer the normal body temperature of birds (40° C or 105°F), and reproduce best at 42° (107.5°F). Go much higher than that and they'll slow down and die.

Pathogenic foodborne bacteria above a certain maximum tem range. The acidity, or pH, of the	peratu	re-and	replic	ate faste	est withi	n an optin	al tempera	
	Lower temp. limit		Upper temp. limit		Fastest growth		Lower pH limit	Upper pH limit
Species	(°C)	(°F)	(°C)	(°F)	(°C)	(°F)	(pH)	(pH)
Bacillus cereus	4	39	55	131	28-40	82-104	4.3	9.3
Campylobacter jejuni	30	86	45	113	37-43	99-109	4.9	9.5
Clostridium botulinum Type A	10	50	48	119	30-40	86-104	4.6	9
C. botulinum Type B	10	50	48	119	30-40	86-104	4.6	9
C. botulinum Type E	3	38	45	113	25-37	77-99	5	9
C. perfringens	10	50	52	126	43-47	109-117	5	9
Escherichia coli (pathogenic)	6	43	50	121	35-40	95-104	4	9
Listeria monocytogenes	-1	31	45	113	30-37	86-99	4.4	9.4
Salmonella spp.	5	41	47	116	35-37	95-99	3.7	9.5
Shigella spp.	6	43	48	117	37	99	4.8	9.3
Staphylococcus aureus	7	44	50	122	35-40	95-104	4	10
Vibrio cholerae	10	50	43	110	37	99	5	10
Yersinia enterocolitica	-2	29	42	108	28-30	82-86	4.2	10

Figure 7.1: How to kill common pathogens. Source: Myhrvold et al. (2011) p.145

The toxins produced by the *Clostridium* genus are among the most dangerous. Botulism (C. *Botulinin*) Tetanus (*C. tetani*), gangrene (*C. perfringens*), and of course C. *Dificile*.

Some bacteria simply use the darkness and wet warmth of the colon as a breeding ground, happily feasting on the materials they find there. They cause trouble not by what they eat, but by what they excrete: nasty toxins that mess up some other part of the body. *Clostridium botulinum* produces the neurotoxic protein botulinum that can weaken or freeze nerve cells. The most acutely lethal toxin known – only 2 billionths of a gram can kill – botulinum is almost as deadly to people as the plutonium in a nuclear bomb. Just a few pounds under the right conditions would kill everyone on earth.

Part of what makes pathogens so dangerous is it takes so few of them to be deadly. Some Shigella species, for example, become infectious with a starter colony of as few as ten organisms.<sup>1</sup>

With such terrible killers lurking out there, it's tempting to divide all microbes into "bad" (pathogenic), "good" (probiotic) and "neutral" (commensal). You'll find plenty of lists that do just that.

<sup>&</sup>lt;sup>1</sup>Kothary and Babu (2001)

But often, perhaps usually, the distinction between good and bad is unclear. Consider the "viridans" *Streptococci*, a group name for a whole breed of related microbes commonly found harmlessly in human mouths. If a few of these escape the mouth and somehow enter the bloodstream, they can land on a heart valve and can cause a dangerous, life-threatening infection. But inside the mouth they are tough competitors to other bacteria that may want a foothold, like the *Streptococcus* that causes Strep Throat. Mix Viridans with Strep A, and Viridans wins every time. So is it good or bad? Well, it's bad if your Viridans makes it to the heart; but in its regular form it protects you from other infections.<sup>2</sup>

People with *Streptococcus lugdunensis* in their noses appear protected from some staph infections, probably because *S. Lugdunensis* produces a microbial antibiotic to kill off its competitors. But *S. lugdunensis* can itself cause skin infections.

Often it's the context that matters. Staphylococcus aureus, found in about a quarter of all Americans, is the agent behind a host of infections ranging from mild skin ailments to the deadly, often untreatable MRSA. But it seems to be harmless when in the presence of Corynebacterium species. <sup>3</sup>

Fortunately, the body is pretty good at fighting off many pathogens. Around 94% of people who ingest *Salmonella* will recover without any medical attention at all.<sup>4</sup> Sometimes the fight against bad bugs is helped by other bugs: *Lactobacillus* for example is especially good at crowding out pathogens.

#### 7.2 Food Allergies

If you attended elementary school before the 1980s, you can remember a time before nut allergies, when school lunches served peanut butter to everyone without the slightest worry that it might cause problems. Now many schools are forced to strictly limit the allowable kinds of food in their cafeterias, even from kids who bring their own lunches. Besides nuts, people suffer from allergies to milk, corn, eggs, fish, shellfish, soy, wheat, and many others.

Oddly, the very existence of food allergies appears to be an entirely modern problem. Medical journals didn't even mention food allergies until 1969, and examples were extremely rare before that. In fact, the very first mention of a food allergy happened about 100 years ago.<sup>5</sup>. Human genetics hasn't changed suddenly in the past half-century, and given the variety of conditions, it seems unlikely that we can blame it on a single toxin or industrial pollutant.

 $<sup>^2 \</sup>mathrm{see}$ page 119 Blaser (2015)

<sup>&</sup>lt;sup>3</sup>https://www.sciencedaily.com/releases/2016/08/160817091034.htm

<sup>&</sup>lt;sup>4</sup>Of course, it's difficult to tell how many people *don't* go to the hospital; this is a risk estimate based on fairly generous assumptions about the amount of the pathogen in eggs and how many people eat them. Hope et al. (2002)

<sup>&</sup>lt;sup>5</sup>as mentioned in Spector (2016) referring to Golbert, T.M., J Allergy (Aug 1969); 44(2): 96–107. Systemic allergic reactions to ingested antigens and Schloss, O., Arch Paed (1912); 29: 219. A case of food allergy

Several intriguing clues point in the direction of microbes as the cause of allergies. One theory, known as the "hygiene hypothesis", says that our modern environments are too sterile, that the immune systems of growing children need to be challenged by threatening invaders from time to time or they become overly sensitive. Now another idea, the "old friends" hypothesis suggests that it's not the hygienic conditions and lack of microbes per se that drive the autoimmune response, but rather it's that our bodies have evolved, over untold generations, to expect microbes in the environment, some nasty and some friendly, and when the developing immune system of a child is never exposed to these microbes, a breakdown occurs that misrecognizes certain foods as enemies instead.

Rutgers University scientist Martin Blaser (Blaser 2015) thinks something odd has happened because of the overuse of antibiotics. There are plenty of people in Western societies who suffer far fewer food allergies, people like the Old Order Amish of Pennsylvania, who for centuries have kept to traditional ways of farming and who live in communities largely unaffected by industrialization. Their significantly greater time spent outdoors, challenged regularly by animal and soil microbial pathogens has made them far less likely to suffer from allergies than the rest of the population. Studies of Amish gut microbiomes show strikingly different profiles, generally with higher diversity and numerous microbes rarely found in urban people<sup>6</sup>.

Asthma, another terrible condition likely sparked by an incorrect balance between hygiene and microbes, points to better times ahead, its numbers of sufferers having peaked in the 1990s and 2000s. In fact, "We have probably seen the worst of the asthma epidemic" writes scientist Tim Spector, who suggests childhood asthma has been replaced by food allergies.

The good news is that, armed with our understanding of the relationship between microbes and allergies, new discoveries may offer treatments or even cures.

Evidence showing that *Clostridia* may counter sensitivity to peanuts <sup>8</sup> has led to additional research behind the source of the problem. Now a new drug, Palforzia, is an FDA-approved treatment option for peanut allegies that works by exposing young children to small doses of the key microbe-stimulating compound in peanuts, letting immature immune systems develop a safer relationship with peanuts. Similar studies are underway for other allergies, lending hope that someday food allergies may once again fade into the background and disappear as they did 100 years ago.

Cathryn Nagler's lab has identified *Anaerostipes caccae* as a key microbe that protects against allergic reactions.<sup>9</sup>

<sup>&</sup>lt;sup>6</sup>Zupancic et al. (2012)

<sup>&</sup>lt;sup>7</sup>Spector (2016)

 $<sup>^{8} \</sup>rm http://www.sciencemag.org/news/2014/08/gut-microbe-stops-food-allergies$ 

<sup>&</sup>lt;sup>9</sup>Feehley et al. (2019) (download the full text here: https://cpb-us-w2.wpmucdn.com/voices.uchicago.edu/dist/e/1480/files/2019/07/Feehleyetal.pdf)

#### 7.3 Gluten

It's been well-established that a gluten free diet impacts the microbiome. This shouldn't be too surprising, given that gluten is a nutrient for some bacteria but not others. But what about people who show an unusual sensitivity, even allergy, to gluten? What's the cause?

Recently the idea of a gluten free diet has taken on fad diet status. Despite surprisingly little research evidence that it can quantitatively affect health, millions of people swear that gluten gives them various ailments from poor digestion to brain fog. If you don't believe it, they'll say, try it yourself and see; and sure enough, many of those who go off gluten claim big health benefits. Eating is usually a zero-sum game: stop eating one thing (say, the gluten in wheat) and you'll end up eating more of something else (rice or corn). Is it the switch to a different diet — and the anticipation of success that this brings — that makes people feel better, or is there something really significant about gluten itself?

The experts say no, with one important exception. A tiny fraction of people do suffer from Celiac disease, a known disorder of the body's ability to handle gluten. There are well-established tests that can definitely tell whether you have Celiac disease or not, and although the vast majority of people test negative, those who are true Celiacs will immediately and obviously benefit from a gluten free diet. But what's driving the difference?

As usual, the genetic evidence isn't completely lock-tight. Although a third of the population have particular versions of the (DQ2 or DQ8) of a cellular receptor called the human leukocyte antigen (HLA), only a tiny minority go on to develop serious gluten sensitivities. Some studies indicate gluten sensitivity arises at an early age, and that perhaps celiac disease can be prevented by exposing babies to gluten at just the right moment, but other studies say the opposite.<sup>10</sup>

These are all clues that the microbiome may be involved, and sure enough, many studies show a definite difference between healthy microbiomes and those with clinically-proven Celiac disease. <sup>11</sup> But because Celiac sufferers tend to eat differently than non-sufferers, it can be hard to tell how much of the microbiome is a result of a different diet, and how much is due to the disorder.

Another clue happens further up the digestive system. Spanish researchers looking at the small intestine found curiously similar microbiomes in both healthy and celiac patients. <sup>12</sup>. The difference happened at the functional level of what those bacteria do, and not necessarily in just whether the microbe is present or absent. Lactobacillus, it turns out, is one of the best degraders of gluten<sup>13</sup>, but there are others: Bacillus pumilus, Stenotrophomonas maltophilia, Pseudomonas aeruginosa. Most interestingly, unlike Lactobacillus, some of these bacteria can do more than just digest the gluten: they appear to contain enzymes that transform the gluten

<sup>&</sup>lt;sup>10</sup>Vriezinga et al. (2014)

 $<sup>^{11}\</sup>mathrm{De}$  Palma et al. (2009)

 $<sup>^{12}</sup>$ Herrán et al. (2017)

 $<sup>^{13}</sup>$ Rizzello et al. (2007)

— pointing to the possibility that the enzymes produced by these microbes could be purified and used to eliminate traces of gluten from food products.

So if Celiac disease is caused by a change in the way some microbes function, how did that change happen in the first place? One theory is that it's a virus. Researchers at the University of Chicago and University of Pittsburgh were able to supercharge the way mice react to gluten by infecting them with a reovirus that apparently changes something about the body's immune response in the presence of the gluten protein. <sup>14</sup>

Members of your household will have more similar microbiomes if there's a dog present.<sup>15</sup>

Humans are able to synthesize just 30 plant-digesting enzymes. Contrast that to the species  $Bacteroidetes\ thetaiotaomicron$  which can break down plant structures using over 260 different enzymes.  $^{16}$ 

#### 7.4 Obesity

Obese and diabetic people are subject to more infections than healthy people, but interestingly it's not the body mass index that drives this, but rather the accompanying hyperglycemia.<sup>17</sup>

#### 7.5 Other conditions

Some people claim you can treat migraine headaches, sinusitus, and other conditions by inserting *Lactobacillus*-containing Kimchi up the nostril. I've not tried it and can't vouch for it, but let me know if it works for you.

#### 7.6 Diversity and health

Most microbiome discussions begin with the assumption that diversity is good. Virtually any popular book or article about how to improve your health will suggest ways to increase diversity, usually by eating specific foods. For what it's worth, a study of more than 10,000 gut microbiomes found only one sure-fire association with higher gut diversity: people who self-report eating more plants have higher diversity than those who eat fewer types of plants, and this is true no matter their diet type (omnivore, vegan).<sup>18</sup>

 $<sup>^{14} \</sup>rm http://www.today.com/health/celiac-disease-may-be-caused-virus-new-study-finds-t110119$ 

<sup>&</sup>lt;sup>15</sup>see Song et al. (2013) or open text

<sup>&</sup>lt;sup>16</sup>see Spector (2016) p.299

<sup>&</sup>lt;sup>17</sup>Thaiss (2018)

<sup>&</sup>lt;sup>18</sup>McDonald et al. (2018)

The intuition is easy to understand: if your body harbors a wide variety of microbes, you'll have a deeper catalog of useful ones that can be applied to new situations. The world around us is constantly changing, and you never know what new threats or opportunities you may encounter. You can respond better if you have an abundant variety of organisms that can meet any challenge.

In practice, diversity is difficult to pin down quantitatively. We know what we mean in principle: having a variety of different microbes seems good, but clearly there are limits. You wouldn't want "variety" to include serious pathogens, for example. We know intuitively that a deciduous forest at sea level, with dozens of differerent tree species, is more diverse than one at a high altitude tree line. But is the one at low altitudes "better"? It depends on where you live!

A similar problem has long confronted ecologists, who have developed several diversity measures that have been adapted to the micro world:

- Alpha diversity: the variance *within* a particular sample. Usually measured as a single number from 0 (no diversity) to infinity, or sometimes as a percentile, this is what most of us mean when we look at our microbiome results and ask about diversity.
- Beta diversity: how samples vary against each other. Many scientific studies are interested in the differences between sites on the body, or microbiomes across geographic locations. Beta diversity is typically the thinking behind "clustering" algorithms that try to show differences or similarities among samples.

All diversity metrics take into account two aspects of a community: the number of different organisms in a sample, and the range of abundances for each one. To understand how this works, think of two forests, each with an equal number of trees. (Table 7.1)

Table 7.1: Diversity example: two forests with an equal number of trees, and one with fewer trees.

Forest	Number of Trees	Number of Species	Diversity
A	1000	1	Low
В	1000	1000	High
$\mathbf{C}$	10	10	?

Clearly, Forest B with its abundance of species and trees is the most diverse. But what about Forest A compared to Forest C?

On the one hand, Forest C seems to have a greater variety of trees: 10 times more than Forest A. But it also has many fewer of them. In other words, there are two aspects of diversity that matter: the absolute number of organisms in an ecosystems, and the variety or *richness* of those that are there.

Whether A is "better" or "worse" than C depends on subjective, non-quantifiable factors that are not included in any diversity metric. A managed forest, such as one on a Christmas tree farm, might be perfectly healthy for one purpose (growing Christmas trees for sale), while an adjacent clear-cut forest with ten lonely and scraggly trees could be far less healthy, even if it has more of a variety of trees.

In this example, we use the distinction *richness* to refer to Forests B, or C, with their greater variety of species, and the overall term *diversity* tries to be a measure of *both* richness and abundance.

We can apply the same principle to our taxonomy tables: A microbiome sample with 100 unique taxa is more diverse than one with only 10 unique taxa. But if we just use raw, absolute numbers, it can be hard to compare across different microbiome tests. For example, what if I have two samples, each with 100 unique taxa, but in one sample there are tiny amounts of all but one of the taxa, while the other sample has equal amounts of everything? Which is more diverse?

One way to quantify this is with a metric borrowed from probability theory. What if, instead of looking at *all* the taxa and their respective amounts, we simply take at random any two taxa from the sample: what is the probability that the two will be the same?

If I have a sample with 100 unique taxa, each of identical abundance, then the odds are pretty low that I would select at random two of the same taxa; conversely, if a majority of the sample consists of the same taxa, with many other taxa of smaller abundance, then the odds are pretty good that the two I select would be the same.

In fact this is generally the case in healthy western guts, which are usually composed of only two large phyla: Firmicutes and Bacteroidetes. In my case, as you'll see, these two phyla make up over 90% of everything in my samples; the third most abundant taxa rarely breaks 10%. The odds that you would randomly pick these two is pretty high. That's the intuition behind the Simpson metric, developed in 1949 by the British scientist E.H. Simpson.

But note that with Simpson, high numbers mean low diversity; after all, in a homogeneous sample with no diversity, the odds that you'll pick the same taxa will be 100%. To keep this consistent with the idea that higher numbers mean more diversity, most scientific studies of the microbiome use Inverse Simpson, which is simply 1 divided by the Simpson number. Note that for very low Simpson numbers, the Inverse Simpson value can be quite high, even approaching infinity when dealing with a microbiome with many unique and extremely low abundance taxa.

The taxonomy of microbes matters too. Each successively lower taxonomical rank always has at least as many taxa as the higher levels, so you can't simply count the total number of taxa at a rank. A single genus like *Bifidobacterium*, for example, can have dozens of species associated with it. For this reason, microbiologists usually measure diversity at the Family level: it's a good compromise between overall coverage and specificity of taxa.

In the real world, the type and variety of microbes in the body are constantly changing, so it's important not to get too hung up on a single number for a single sample. You'll see this later when we look at how diversity changes in my own experiments

The key is to take multiple samples and not rely on a single day's measure. If you take many samples over time, you'll find that the moving average is much more stable, and a better overall indicator of diversity.

There are other measures of diversity as well. The *Shannon Index* borrows from Information Theory to ask how much unique information is contained in a given sample. A radio signal that broadcasts random static, for example, would have a lower Shannon number than one for a music concert. Similarly, a microbiome with a boring makeup – all the same species, for example – would have a lower Shannon number than one containing a rich abundance of many different types of microbes. In practice, *Shannon* and *Inverse Simpson* tend to track one another reasonably well, a clue that they are getting at a similar idea. (Figure 7.2))

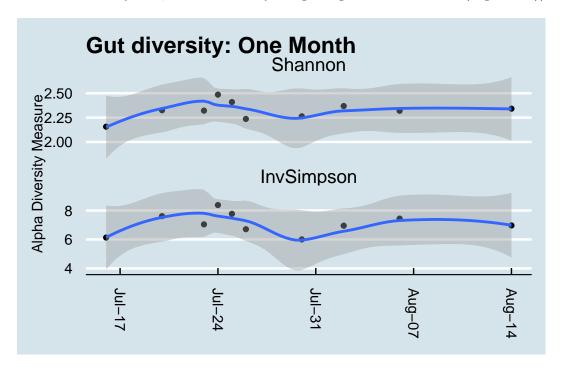
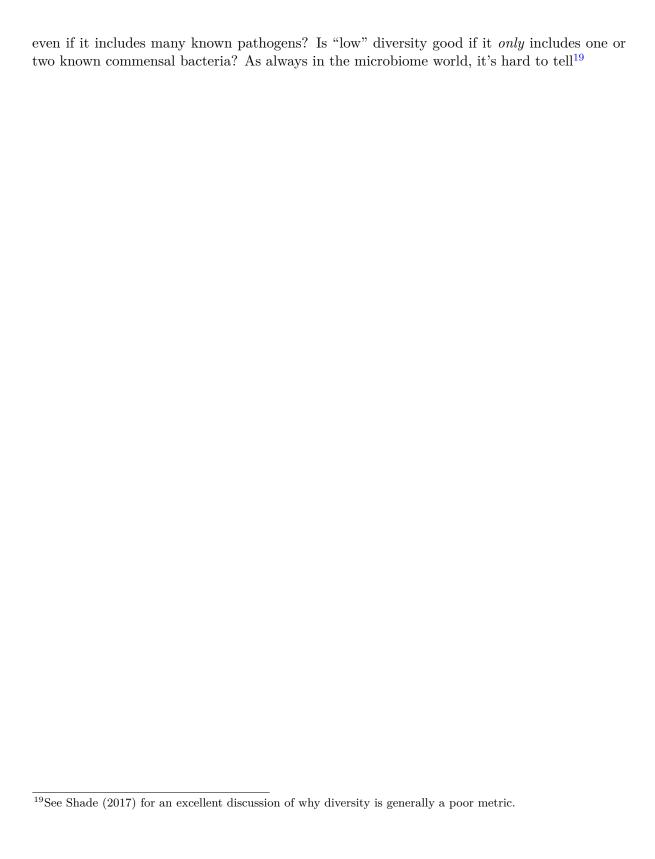


Figure 7.2: Comparing two types of diversity.

That said, Shannon tends to fall within a narrower, more predictable range, so I prefer it over Inverse Simpson when looking at my own samples. It often doesn't matter which metric you use, though, as long as you're consistent.

Nevertheless, I have learned to not place much stock in any diversity measure. After all, whether diversity is "good" or "bad" depends on what is in the sample. Is high diversity good



# Part III Technology

# 8 Methods

This chapter will go into more detail about methods, building on the Explore Your Microbiome chapter to show more precisely how I measured myself and how I used the tools needed to build this book.

## 8.1 The technology for studying microbes

People have been farming the microbes in fermented foods for thousands of years, so when in Pasteur times, scientists first began to cultivate them for experiments, the most obvious way was through the process known as "culturing". Take a sample containing some microbes of interest, and leave them sit in a hospitable environment long enough for them to reproduce in enough quantity to be useful. That's still a common way to study microbes, and that couple-of-day incubation period is one reason you don't get your lab tests back for a few days.

Culturing also has several serious limitations. It only works if the microbes are still living, which rules out many important situations. Many microbes don't culture well or at all outside their native habitat.

Anaerobes are organisms that can't survive in the presence of oxygen, not a problem deep inside the airless gut, but it won't work in a normal lab. While you can take some precautions to preserve the original environment as much as possible – you can set the organisms in a specially-sealed oxygen-free container –the cost and expense rises quickly.

Even if, somehow, you were able to overcome all the other challenges, many (perhaps most) microbes don't grow well unless they are in close proximity to other specific species. *Methanobre-vibacter smithii*, for example, which plays a critical role in the efficient digestion of complex sugars, removes hydrogen from its environment, providing a habitat for organisms that don't like hydrogen, like *Firmicutes* and *Bacterodetes*. Plus, it converts all that excess hydrogen to methane, which in turn is needed by yet other organisms. Culturing any of those microbes on their own would be difficult, if not impossible.

But the techniques for uncovering which organisms are where and what they are doing was revolutionized in the first decade of the 2000s by those new-fangled gene sequencers that were so usefully applied to human genes.

#### 8.1.1 The 16S rRNA Gene

Despite the plunging costs of DNA sequencing, the trillions of microbes in your gut still present a formidable chellenge if you intend to sequence them all. Even the humble *E. coli* contains nearly five million DNA letters. There is some commonality between related organisms — humans and chimpanzees, for example, share upwards of 90% of their DNA — but in general it's hard to use the DNA strand itself to measure the relatedness between two organisms. Understanding the reason for this may help you understand why there is a clever shortcut.

You might think you can measure the relatedness of two organisms by looking at all the DNA in each one and computing the percentage that each shares in common. This would work, but sequencing all those billions of DNA bases takes a lot of time and money, and it would be impractical in a case like the microbiome where you may need to do this for millions of individual organisms.

A service like 23andme is able to cheaply compare individuals of the same species (i.e. Humans) because the generic human genome is already well-mapped and we know that of the 3 billion base pairs, only about 3 million (the SNPs or single-nucleotide polymorphisms) are different between individuals. When you give your spit sample to 23andme, they give you back a subset of your SNPs, only those that have been studied enough to be interesting. SNPs are easy and cheap to find using a "gene-chip", a special semiconductor-like device that can quickly look at 1 million or more pre-determined spots on your DNA. But this is only possible because the map itself already exists, thanks to multi-year effort of the Human Genome Project that finished in the early 2000s. There are no comprehensive gene chips (yet) for bacteria, and certainly not for all the millions of species in nature. And even if there were such chips, bacteria are notorious at adapting and changing to their surrounding environment, exchanging genes with one another, that it just wouldn't be practical to identify enough constant genes to make it worthwhile.

Fortunately, to get an overall picture of the types of microbes in your body, we don't have to sequence every piece of DNA. For our purposes, we just want to know *which* organisms are there, and in what abundance. The precise bits of DNA are important only if they let us know the names of the microbes, and for this we don't need to bother sequencing everything. In fact, most bacterial species differ enough from each other that we need only a few bits of DNA from each in order to tell them apart.

We know that all bacteria are distantly related to one another, and that closely-related species will have more DNA in common with each other. But some of parts of DNA are so important that they stay virtually identical even across entire families of organisms. Remember that DNA describes absolutely *everything* about the organism, including the workings of very low-level cell process. Not just the size or shape, but much more fundamental: how a cell divides, for example, or even how to use the oxygen a cell needs for survival.

Among the most fundamental of all processes is what happens in every cell's ribosome, a special molecule that is core to how a cell converts DNA into proteins. Because all cells create

proteins, they also always contain a ribosome and, importantly, they contain the *instructions* for how to create a ribosome in the form of the ribosomal gene. Each cell's DNA includes a gene that precisely encodes every protein, in the exact order that makes up the ribosomal structure. A special enzyme, called DNA polymerase, manufactures new bits of RNA on the fly as it hits portions of the DNA. These bits of RNA, called messenger RNA or mRNA, eventually make their way to ribosomes, which are floating throughout the cell. Upon hitting the ribosome, mRNA is converted into the proteins that make all life possible. If it happens that the mRNA hits upon a segment of DNA that encodes a gene for a ribosome, guess what new molecule is manufactured? A new ribosome!

This ribosomal gene is such a fundamental part of every living organism that very little about the ribosome changes, even after hundreds of millions of years of evolution. Humans and corn plants actually share quite a bit of the ribosome; both are prokaryotes, for one thing, so many of our cellular processes work the same. But bacteria go back even further than humans and corn plants, enough so that the differences aren't so subtle anymore. In fact, the differences are big enough that, with clever selection of the part of the genome to sequence, you can tell the difference between two bacteria in a few hours for a fraction of the cost of running through all the DNA you might find in a microbiome.

The gene that encodes ribosomal RNA (written rRNA) for bacteria consists of about 1500 base pairs total, a tiny fraction of the entire genome, and although it is mostly identical across all bacteria, there are *some* differences, all of which are contained in nine "hypervariable" regions containing even fewer base pairs. These regions, named V1 through V9, are surrounded by strings of base pairs that are constant throughout all bacteria, and can be quickly discovered and amplified by the right DNA primers. The fourth one of these regions, V4, contains only 250 base pairs, and is quickly and easily sequenced on commercially-available sequencing machines.

When you submit your sample to a lab, the bacterial cells must first be cut into pieces ("lysed", to use the technical term). Sometimes the first part of this process happens at collection time, when you swab a tiny bit of your sample into a vial and stir. The vial contains tiny "beads" that smash into the cell walls as you stir, breaking them apart to spill their contents in an ugly liquid "goo".

The lab is interested only in the DNA inside that goo, so they start by dropping in some carefully-constructed "primers". These are bits of known, synthetically-made DNA that are designed to bind just to the parts of the cell DNA that make ribosomes. In particular, these primers will only find bits of DNA that make the specific, V4 subregion of the ribosome. Primers naturally bind and then break open the DNA at precise locations, cutting out all the segments that match.

Throw this goo into a centrifuge spinning at a carefully controlled, very high speed, and different parts of the goo will rise to different levels, reflecting their molecular weights. One specific part, corresponding to the section programmed to make ribosomes, will rise to a centrifuge level referred to as "16S". Precisely skimming the goo at that spot will give the

technician a collection of DNA from just one part of the ribosome of bacteria. The rest of the DNA, millions of letters (base pairs) per bacteria, will not be sequenced and is simply discarded. That's the shortcut. Instead of sequencing millions of base pairs, we need sequence only hundreds.

Once you have a bunch of that 16S ribosomal gene, you know that you are looking exclusively at non-human bacterial and archaeal DNA. It's a tiny subset of all the genetic information in the microbiome, but combined with one more shortcut, it gives a surprisingly accurate look at the overall composition of a sample.

The remaining shortcut is possible thanks to years of research of sequencing the genes in bacteria. Scientists in labs around the world have been faithfully digging up samples of bacteria, and performing whole-gene sequencing on what they find. Although 250 base pairs may seem like a tiny number to differentiate among all possible bacteria on earth, for gut microbiome purpoes we need concern ourselves only with those that are known to inhabit humans. The Human Microbiome Project already identified most of these bacteria – and their 16S gene identifiers – so armed with that as a reference database<sup>1</sup>, it is generally possible to unmask a specific microbe with just a sliver of DNA.

It's this two-step combination, 16S "skimming" and a database lookup, that makes it cost effective to study the millions of organisms in your microbiome. You don't have to do a complete gene sequence on every single bacterium; just trust that the tiny subset of DNA in the 16S region is enough to uniquely match something already in the bacterial database.

The alternative – sequence everything in the sample – provides much more accuracy of course, but the 16S approach comes surprisingly close. Careful studies that compare with the "sequence everything" (aka metagenomic) approach show that 16S is still surprisingly close – at least 80% and often much more of the entire microbiome can be categorized accurately, even at the species level.

#### 8.1.1.1 Limitations of 16S

While 80%+ accuracy for such a cheap and fast method of sequencing is impressive, it's important to remember that we're still not seeing the whole story. Despite its low cost and wide use, microbiome studies that focus only on the 16S gene suffer from several inaccuracies compared to other, more expensive methods.

For one thing, this type of sequencing sees only the bacteria in a sample. Other important single-cell, invisible microbes won't be detected: yeasts, fungi, and most archaea. Viruses, including phages that prey on bacteria, are also not part of the 16S summary.

The thousands of genes in each of the trillion bacteria in your system are doing important work that won't be visible if we sequence a portion of just one of them. Much of the time,

<sup>&</sup>lt;sup>1</sup>A very popular one is Greengenes: http://greengenes.secondgenome.com/downloads. Learn about all the big ones here: https://bmcgenomics.biomedcentral.com/articles/10.1186/s12864-017-3501-4#Fig3

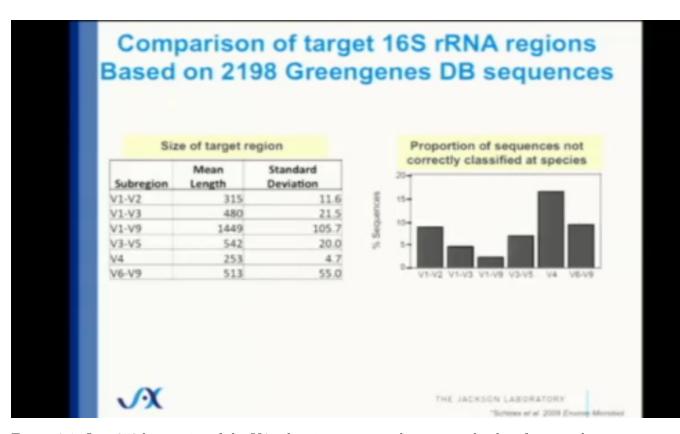


Figure 8.1: Just 253 base pairs of the V4 subregion are enough to correctly classify more than 80% of the species in a sample. (Source: Jackson Laboratory)

this doesn't matter, because the vast majority of the unsequenced portion is genes that are identical to those that have already been sequenced by previous scientists. To use an analogy in the visible world, if you have identified that an organism is a bird, it's very likely – though not certain – that it can fly. For nearly all bird species that would be a safe bet, but among the birds that actually matter to humans, you'd have an important detail wrong about chickens.

Other problems with 16S microbiome testing technology: it's limited in what it can see, and RNA itself is too unstable. One careful study concluded:

"16s rRNA predicts genome-wide levels of similarity very well for distantly related prokaryotes, but not for closely related ones"<sup>2</sup>

Worse, there are many important bacteria that share identical 16S sequences yet occupy entirely different ecological niches <sup>3</sup>. Because the sequences are identical, different labs may arbitrarily assign different names to the same organism. <sup>4</sup>

#### 8.1.2 Limitations of collection

Another source of possible error depends on how the sample was collected, and how it was handled after collection. The gold standard of collection requires a subject to be physically present in a lab, where the sample is collected and sequenced immediately, or else quickly frozen and then pulverized into tiny pieces that are carefully blended and then sequenced. Not only is that expensive, but it requires the subject to "poop on demand", which isn't always feasible. A common alternative asks the subject to place all or a scoop of the sample into a freezer which is sent to the lab later.

Most home-based collection methods require you to collect a tiny swab of material which is then placed in a vial for shipment through the mail. The vial usually contains a special buffering chemical that keeps any DNA inert during transit. Because DNA is generally pretty stable, a vial preserved this way can usually remain usable for months or even years at room temperature.

How much does that affect the final result?

Several studies have tried to compare collection methods, with mixed results. The most systematic study, performed by scientists at the Centers for Disease Control tested 8 hospital patients.<sup>5</sup> Collecting samples from the bowel movements as well as rectal swabs inserted up the you-know-where at specific time periods, the researchers concluded that the differences within an individual are much smaller than the differences between individuals. In other words,

<sup>&</sup>lt;sup>2</sup>Lan, Y., Rosen, G., & Hershberg, R. (2016). Marker genes that are less conserved in their sequences are useful for predicting genome-wide similarity levels between closely related prokaryotic strains. Microbiome, 4(1). https://doi.org/10.1186/s40168-016-0162-5

<sup>&</sup>lt;sup>3</sup>Jaspers and Overmann (2004)

<sup>&</sup>lt;sup>4</sup>a good summary is in Pollock et al. (2018)

 $<sup>^5</sup>$ Bassis et al. (2017)

although a single sample may have some variability depending on exactly where you swab, it won't matter if you're comparing to somebody else.

I tried several different ways of collecting samples, and discovered that the results do indeed depend greatly on the sampling conditions. See my detailed results in the Experiments: collection chapter.

The above limitations are important, and there's no question that you should keep them in mind when exploring your own microbiome, but the low price and accessibility of the technology makes up for it in many important applications.

Thans to these new machines originally developed for mass DNA sequencing, the process of finding and understanding microbes has been revolutionized. It's now possible to search for new life forms without growing them in a culture, and this has made possible a major shift in how to think about life —and what is important and special about human hardware.

Unlike the genetic discoveries you can make by understanding your DNA (from a low-cost consumer service like 23andme), much of the news from the microbial world is *actionable*. There's little, if anything, you can do if you find you have a particular type of gene that gives you, say, a propensity to alzheimers for example. But because the microbes around you are constantly changing anyway, and because you can influence which ones grow and which don't, the world of the human micro biome is eminently *actionable*.

# Part IV Do It Yourself

# 9 Microbes to Watch

Your gut as seen by consumer-priced sequencing technology contains many more unique microbial species than you can possibly track, at least hundreds in most people and potentially over 1000. I've seen 1083 different ones in my own results. And that's just using the comparatively crude 16S technology. More comprehensive estimates based on other technology find as many as 36,000 different species<sup>1</sup>! With that much variety, how do we find the ones that matter?

Fortunately, only about 14 strains of 10 species account for 80% of a typical gut microbiome<sup>2</sup>

In this chapter, we'll just consider the most common microbes and the overall consensus on what they do. Later, in the chapter on experiments, we'll show more about how you can manipulate them.

What you're really wondering is how does your sample compare to others? Do you have an unusual abundance (or lack) of a particular taxa? Is there something that might indicate a greater or lesser similarity between your sample and certain other types of people? That is a very difficult question which we'll address over and over in this book, but for now let's just look at overall abundances of some key microbes.

# 9.1 Phylum

! Important

This section is under construction

In biology, a phylum (/ fa ləm/; plural: phyla) is a taxonomic rank used to classify organisms. It is a group of related classes. The term was coined by Ernst Haeckel in 1866.

Traditionally, in botany the term division has been used instead of phylum, although the International Code of Nomenclature for algae, fungi, and plants accepts the terms as equivalent. Depending on definitions, the animal kingdom Animalia contains about 31 phyla, the plant kingdom Plantae contains about 14 phyla, and the fungus kingdom Fungi contains about 8 phyla.

<sup>&</sup>lt;sup>1</sup>See (Frank et al. 2007) or click for the open access download

<sup>&</sup>lt;sup>2</sup>See the detailed estimates here: (Kraal et al. 2014)

At its most basic, a phylum can be defined in two ways: as a group of organisms with a certain degree of morphological or developmental similarity (the phenetic definition), or as a group of organisms with a certain degree of evolutionary relatedness (the phylogenetic definition). Attempting to define a level of the Linnean hierarchy without referring to (evolutionary) relatedness is unsatisfactory, but a phenetic definition is useful when addressing questions of a morphological nature—such as how successful different body plans were.

The concept of phylum is based on the idea that organisms that share a common ancestor are more closely related to each other than organisms that do not share a common ancestor. This means that organisms in the same phylum are more likely to have similar characteristics than organisms in different phyla.

For example, all the animals in the phylum Chordata share a common ancestor that had a notochord, a rod-shaped structure that supports the body. This means that all chordates have a notochord at some point in their development.

The concept of phylum is also based on the idea that organisms in the same phylum are more likely to have a similar evolutionary history than organisms in different phyla. This means that organisms in the same phylum are more likely to have evolved from a common ancestor in a similar way.

For example, all the animals in the phylum Chordata have a common ancestor that lived about 500 million years ago. This ancestor was a small, worm-like creature that lived in the ocean. Over time, this ancestor evolved into the different types of animals that we see today, including humans, fish, and birds.

The concept of phylum is a useful tool for classifying organisms and understanding their evolutionary relationships. It is also a useful tool for studying the diversity of life on Earth.

The gut microbiome of most westerners is dominated by Firmicutes and Bacteroidetes, which together make up 80% or more of the total sample. Most people also have smaller amounts of Actinobacteria, Proteobacteria and Verrucomicrobia. This overall composition is so common in healthy people that it's tempting to assume their dominance is "natural" or "normal", but like much else with the microbiome, the situation is different outside the western world, a clue that it's difficult to summarize a single individual's microbiome as "good" or "bad." It all depends.

## 9.2 Genus

Important

This section is under construction

In biology, a genus is a taxonomic rank used to classify organisms. It is a group of species that are closely related to each other. The genus name is always capitalized and comes first in the binomial nomenclature of a species. For example, the genus name for humans is Homo, and the species name is sapiens.

The concept of genus was first introduced by the Swedish naturalist Carl Linnaeus in his 1753 work Species Plantarum. Linnaeus divided all living things into three kingdoms: plants, animals, and minerals. He then divided each kingdom into classes, orders, genera, and species.

The genus is a useful tool for classifying organisms because it allows us to group together species that share similar characteristics. For example, all the species in the genus Homo share the following characteristics: they are bipedal, they have large brains, and they use tools.

The genus is also a useful tool for understanding the evolutionary relationships between organisms. Species that are closely related to each other are usually placed in the same genus. For example, humans and chimpanzees are both placed in the genus Homo. This suggests that humans and chimpanzees are closely related, and that they share a common ancestor.

The genus is an important part of the biological classification system. It is a useful tool for grouping together organisms that share similar characteristics, and for understanding the evolutionary relationships between organisms.

In the context of the human microbiome, the genus is a useful way to group together different types of bacteria. For example, the genus Lactobacillus contains many different species of bacteria that are found in the human gut. These bacteria play an important role in digestion and immune function.

The genus is also a useful way to study the evolution of the human microbiome. By comparing the genomes of different species of bacteria in the same genus, we can learn about how these bacteria have evolved over time. This information can help us to understand how the human microbiome has changed in response to changes in our environment.

The term "genus" may not make intuitive sense to somebody used to thinking of eukaryotes or other organisms that reproduce via gametes. This is because the concept of genus is based on the idea of shared characteristics, which is not always clear-cut in the case of prokaryotes.

For example, the genus Escherichia contains many different species of bacteria that are very different from each other in terms of their appearance and their metabolism. However, they all share a common ancestor and they all have a similar DNA sequence. This is why they are all placed in the same genus.

Another example is the genus Lactobacillus. This genus contains many different species of bacteria that are found in the human gut. They all have a similar appearance and they all ferment carbohydrates. However, they have different DNA sequences and they are not all closely related to each other. This is why some scientists believe that the genus Lactobacillus should be divided into several different genera.

The concept of genus is also complicated by the fact that prokaryotes can reproduce asexually. This means that they do not produce gametes, and they do not have a sexual cycle. As a result, it can be difficult to determine how closely related two species of prokaryotes are.

Despite these challenges, the concept of genus is still useful for classifying prokaryotes. It allows us to group together organisms that share similar characteristics, and it can help us to understand the evolutionary relationships between organisms.

You're likely to hear most about the genus level because it's the most detail that cheap sequencing technologies can get right – most of the time.

Bifidobacterium is a key component of virtually all popular probiotic supplements, partly because it is so easy to manufacture, but also due to its proven association with sleep and other aspects of health. A six month picture of my levels shows some dramatic ups and downs (See Figure @ref(fig:summarPlotBifido)).

## 9.3 Species

Important

This section is under construction

When you hear the term "species", you probably think of a specific kind of creature, like a dog or a cat. More generally, among the kinds of plants and animals we encounter in the visible world, the term "species" refers broadly to organisms that can mate with one another to produce offspring of the same kind. Cats and dogs are different species because they can't mate with each other.

But bacteria don't mate: they reproduce by dividing themselves in half. So how do we define a species? In fact, even terms like "parent" or "child" aren't quite appropriate if each new cell is an identical copy of the old one. For very broad categories, like phylum or even genus, the similarities among like cells is high enough that we feel comfortable grouping them together with a common name, but at what point do we reach the lowest, most *specific* level.

The answer is tricky for another reason, called *horizontal gene transfer*, a process by which sometimes (in fact, quite often), a microbe will absorb genes from nearby organisms, altering its genome and its corresponding functions, sometimes significantly. Once that happens, the resulting new microbe can itself divide indefinitely, producing more and more copies of itself with the new gene. Although the new microbes still mostly resemble their original ancestor, if the new gene makes a protein that affects your body somehow, it might as well be an entirely different species.

The term "species" may not make intuitive sense to somebody used to thinking of eukaryotes or other organisms that reproduce sexually. This is because the concept of species is based on the idea of interbreeding, which is not always possible in the case of prokaryotes.

For example, the bacterium Escherichia coli can reproduce both sexually and asexually. When E. coli reproduces sexually, it produces two new cells that are genetically identical to each other. However, when E. coli reproduces asexually, it produces new cells that are not genetically identical to each other. This means that it is possible for two strains of E. coli to be genetically very different from each other, even though they are both members of the same species.

Another example is the bacterium Lactobacillus. This bacterium can also reproduce both sexually and asexually. However, Lactobacillus does not produce gametes, and it does not have a sexual cycle. As a result, it is not possible to determine how closely related two strains of Lactobacillus are based on their DNA sequence.

The concept of species is also complicated by the fact that prokaryotes can evolve very rapidly. This is because prokaryotes have a very simple genome, and they can replicate their DNA very quickly. As a result, it is possible for two strains of prokaryotes to evolve into two different species in a very short period of time.

Despite these challenges, the concept of species is still useful for classifying prokaryotes. It allows us to group together organisms that share similar characteristics, and it can help us to understand the evolutionary relationships between organisms.

Another way that "species" is different from our everyday usage of the term relates to the way microbial organisms are further differentiated by "strain".

A strain is a group of organisms within a species that share certain characteristics. Strains can be defined based on their physical appearance, their genetic makeup, or their response to certain environmental conditions. Strains are often used in microbiology to study the diversity of a particular species.

For example, there are many different strains of E. coli. Some strains of E. coli are harmless, while others can cause food poisoning. The strains of E. coli that cause food poisoning are typically more resistant to antibiotics than the harmless strains.

Strains can also be used to study the evolution of a particular species. By comparing the genomes of different strains of a species, scientists can learn about how the species has evolved over time. This information can help scientists to understand how the species is likely to respond to changes in the environment.

In other words, a strain is a group of organisms within a species that share certain characteristics. Strains can be defined based on their physical appearance, their genetic makeup, or their response to certain environmental conditions. Strains are often used in microbiology to study the diversity of a particular species, and to study the evolution of a particular species.

# 10 My Experiments

Microbe numbers shift daily in response to your environment, so a single sample won't give much more than a brief snapshot at a single point in time. Here are some of the experiments I've tried on myself, in over 600 tests since 2014. What happens in your case?

## 10.1 Summary of My Experiments

During the period from 2014 through early 2019, I sequenced over 600 samples of my microbiome. Inspired by the experiment in a 2014 paper by David Lawrence<sup>1</sup>, during most of that time I also carefully tracked the food I ate, my sleep, and other variables like activity or location. Most of my near-daily samples were of my gut, but I also regularly tested my skin, nose, and mouth. Since I'm generally healthy, I didn't have a specific goal in mind other than to try to understand better what these microbes are doing, so many of my tests were taken while undergoing simple experiments, like eating a specific type of food or visiting a new location. While not necessarily up to the rigorous standards of a formal scientific trial, these "n of 1" studies on myself helped me discover several new interesting facts about my own microbiome, many of which appear to contradict other published studies. In addition, hundreds of people sent me their own test results, letting me compare many different microbiomes. And of course, I also followed the latest developments in scientific publications and the general press as I eagerly tried to learn more.

What follows is a brief overview of some of the key things I learned.

- The microbiome is highly variable from day to day, often moving in ways that appear indistinguishable from random.
- Broad trends are there if you look closely. I found many intriguing new results.
- It is possible to change your microbiome in specific circumstances.
- People's microbiomes are frustratingly different from one another. A feature that seems to be true about one person may not apply to another.

<sup>&</sup>lt;sup>1</sup>David, Materna, et al. (2014)

## 10.1.1 Diversity

The general consensus is that diversity is good: a greater variety of microbes ensures more resilience against the daily threat of invaders. Many people, after taking just one test, often feel either reassured that their diversity is "good" or disappointed that it's "bad". But I find that day-to-day variability is high enough that it's almost never useful to use a single result. For example, here's my diversity during a typical week: (Figure 10.1))

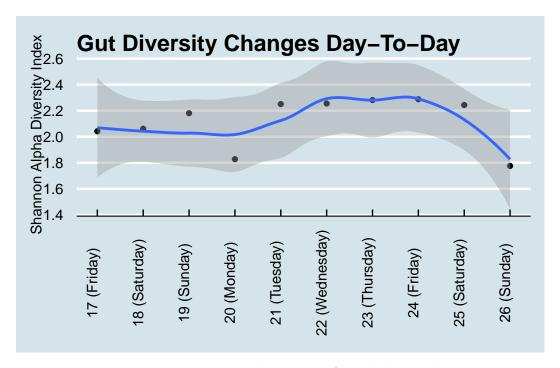


Figure 10.1: Diversity changes significantly day-to-day.

If Monday were my only test, I may have been disappointed with my 1.83 score. Wait another day or two and, with no significant changes in diet, I was up to 2.29 – before plunging to 1.78 by the weekend. Moral: don't take a single result too seriously.

To get a sense of how much diversity can vary over a year (Figure 10.2))

## 10.2 Kefir and the Microbiome

Everyone interested in the microbiome eventually has to check out kefir. Google the phrase "one of the most potent probiotic foods available" and you'll find kefir in all the top results. A recent BBC documentary that tested people after consuming different types of "gut-friendly" foods found it had by far the biggest effect. My interest piqued when, after my disappointment with kombucha, I spoke with a man who happened to mention his good luck with kefir as a

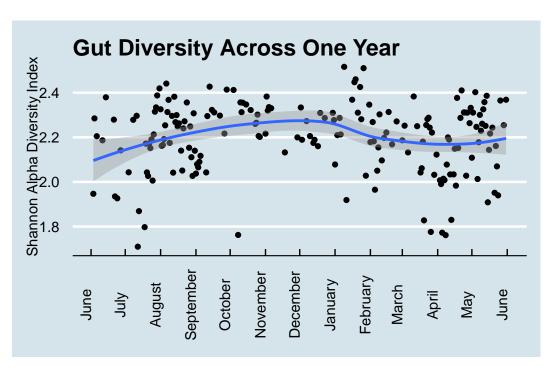


Figure 10.2: Gut diversity varies day-to-day but holds to a recognizable range within a single individual

solution to his many gut issues. On a doctor's recommendation, he tried kefir for a number of years with limited success, until — frustrated with the \$3/day expense of buying it at Trader Joe's — he began making it himself at home. "What a difference!" he claimed.

Did it work for me? Yes! I found a very noticeable change in my gut microbiome — the most significant I've seen among my many experiments. Look at my daily levels of *Leuconostoc*, a prodigious synthesizer of Vitamin K known to be found in kefir. (Figure 10.3)

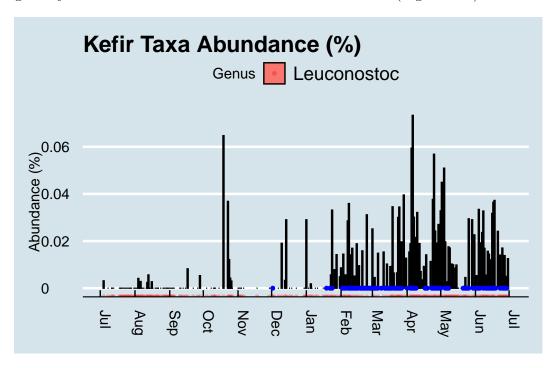


Figure 10.3: Levels of this key microbe jump suddenly when I drink kefir (blue dots)

The blue dots in the chart are days when I drank kefir. Since I sample near-daily over the entire chart, we can see that both of these taxa suddenly appeared shortly after I began to consume kefir. I had almost none beforehand. Also note that the levels seem to dip when I skip drinking for a few days, such as during my business trips out of town in mid-March and another in early-April.

So apparently it has a big effect on the microbiome. What is this stuff anyway?

The first thing to know about kefir is the pronunciation. Say "Keh-FEAR", with the accent on the second syllable, not "KEE-fur" or "kEH-fir". The Russian origin of the term is a reminder of a time in the distant past when — it's unclear exactly where or how — the first batch was prepared and then passed along, its microbial components shared from person to person until it reached today's status as a popular drink you can buy in most grocery stores.

Making it at home brings more than just financial benefits. Commercially-purchased drinks are subject to unavoidable regulatory, shelf-life, and consistency contraints that matter for

successful business, but not necessarily for nutrition. More importantly, if you believe like I do that microbes are highly-customized to our environments, making at home will ensure that the kefir is well-adapted to your own personal microbial environment. The batch that survives and thrives in your kitchen will have proven its ability to withstand whatever conditions you face there.

Making it yourself is surprisingly easy. It begins with a bundle of the component microbes, a cauliflower-shaped substance usually called the "grain" or "seed" that looks like Figure 10.4

Instruction books often tell you to be careful how you handle the grains, but I find them robust enough that I pick them up with my bare fingers. I drop them into a glass of milk left I leave sitting on the counter overnight and — voila! — twenty four hours later, the liquid has turned into kefir. Pull out the kefir grains from that glass, plop it into another, and you're all set for tomorrow's batch. Unlike yogurt, which requires heating and a stable temperature, kefir doesn't appear to care how it's handled, so long as you keep it at room temperature and can wait for twenty four hours. The reaction might vary by a few hours if the room is a bit colder or warmer, but otherwise I find it surprisingly consistent. Just set and forget.

I found that the only hard part is getting started. Once you have the grains, making more kefir is easy, but where do you get the grains in the first place? It's supposedly possible to make them from scratch using a goat-hide bag filled with pasteurized milk and the intestinal flora of a sheep, but I haven't tried that myself. I'm told it works so long as you shake every hour and maintain a constant temperature.

You can order some starter grains online for under \$25, but for shipping purposes the manufacturers generally give them to you in a freeze-dried form that requires a week or so of preparation before the microbes are fully alive and kicking out drinkable quantities of kefir.

I got mine by asking around until I found a neighbor who had been brewing his own. Anyone who makes homemade kefir will be happy to give you some extra grains. The fermentation process causes the grains to multiply, and you will find yourself throwing them out regularly.

The grains themselves contain a combination of lactic acid bacteria (*Lactobacillus*, *Lactococcus*, *Leuconostoc*), acetic acid bacteria (*Acetobacter*), and yeast, clumped together with casein (milk proteins) and complex sugars in a type of carbohydrate molecule called *kefiran*. The nutritional content apparently varies depending on fermentation time and other factors, but there's a lot of good stuff in there<sup>2</sup> (Figure 10.5).

A rigorous microbial analysis by an Irish lab <sup>3</sup> shows precisely which microbes are present in kefir at various stages in the fermentation process. This chart shows the composition of ordinary pasteurized milk as it changes from before adding kefir grains (time 0 at the bottom) until 24 hours have passed (top) and the milk has been transformed into just *Acetobacter*, *Lactobacillus*, and *Leuconostoc*.

<sup>&</sup>lt;sup>2</sup>Otles and Otles (2003) http://files.cienciapatodos.webnode.pt/200000022-79ffe7af9e/Kefir.pdf

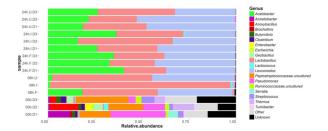
<sup>&</sup>lt;sup>3</sup>Walsh et al. (2016). Also a 2-minute Youtube presentation



Figure 10.4: A few of these cauliflower-shaped kefir grains will fermet a whole glass of milk

Components	100 g	Components	100 g
Energy	65 kgal	Mineral content (g)	
Fat (%)	3.5	Calcium	0.12
Protein (%)	3.3	Phosphor	0.10
Lactose (%)	4.0	Magnesium	12
Water (%)	87.5	Potassium	0.15
		Sodium	0.05
Milk acid (g)	0.8	Chloride	0.10
Ethyl alcohol (g)	0.9		
Lactic acid (g)	1	Trace elements	
Cholesterol (mg)	13	Iron (mg)	0.05
Phosphatateds (mg)	40	Copper (ug)	12
		Molybdenum (up)	5.5
Essential amino acids (g)		Manganese (µg)	5
Tryptophen	0.05	Zinc (mg)	0.36
Phenylalanin+tyrosine	0.35		
Leucine	0.34		
Isoleucine	0.21	Aromatic compounds	
Threonine	0.17	Acetaldehyde	
Methionine+cystine	0.12	Diagetyl	
Lysine	0.27	Apetoin	
Valine	0.22		
Vitamins (mg)			
A	0.06	B <sub>11</sub>	0.5
Carotene	0.02	Niacin	0.09
B <sub>1</sub>	0.04	C	1
B <sub>1</sub>	0.17	D	0.08
B	0.05	E	0.11

Figure 10.5: Nutritional content of kefir. (Source: Otles and Otles 2003)



The uBiome test I used unfortunately can't detect yeasts, so I don't have an easy way to track the non-bacterial microbes in my kefir. But I can run the mixture through the same gene sequencing that I use for my other samples. I tested the kefir twice: once by simply dabbing the swab into the mixture that was waiting for me in the morning, and another swab from the same batch after removing the grain for an additional 24-hour "second ferment". This is what I found when I sequenced the kefir from two different batches: (Table 10.1)

Table 10.1: Results from sequencing two distinct types of kefir (Genus)

	Kefir1	Kefir2
Lactococcus	96.06	1.07
Leuconostoc	3.02	0.06
Lactobacillus	0.22	98.40
Faecalibacterium	0.14	0.01
Roseburia	0.06	0.00

These are the only taxa that met the 0.07% abundance criteria discussed previously. But even without that cutoff, the uBiome pipeline shows no *Acetobacter*, despite its prominence in the study shown above.

I wondered if this is simply due to the way uBiome labels the taxa that are found. Maybe the label *Acetobacter* just isn't often assigned to uBiome samples. When I checked, I could find none in any of my own samples or of the hundreds of others that people have sent me. What's

more, none was reported in a large population study<sup>4</sup> either. So apparently it just doesn't show up often in humans, though I wonder why it wouldn't show up in the 16S sequencing of my kefir sample.

The answer, according to the uBiome scientist I talked to, is that *Acetobacter* is too similar to other genera for it to be accurately distinguished with a 16S test. So if we can't see at the genus level, let's look at a higher level, such as phylum. Table 10.2

Table 10.2: Results from sequencing two distinct types of kefir (Phylum)

	Kefir1	Kefir2
Firmicutes	99.75	99.57
Bacteroidetes	0.12	0.06
Proteobacteria	0.09	0.36
Actinobacteria	0.03	0.01
Verrucomicrobia	0.01	0.00

Because Acetobacter is within Phylum Proteobacteria and Order Rhodospirillales, we would expect to see some of those microbes if any of it were present. Looks like my kefir doesn't include anything remotely resembling Acetobacter.

That's what's in the kefir grain itself. How does regular drinking affect my gut microbiome?

To find any taxa that may have suddenly changed as a result of kefir-drinking, let's look at a heatplot that shows the relative abundances of all my top microbes over time. Darker spots are days when I have *less* of a particular bacterium, lighter spots are days when I have more.

Note the sudden appearance of the genus *Fusicatenibacter*. You rarely see such a dramatic and consistent change as a result of an experiment, but unfortunately, little is known about this genus. A member of the Clostria class of phylum Firmicutes, an internet search reveals little of interest. But it definitely appears in my samples after drinking kefir.

In fact, look how the levels appear to coincide precisely with the periods when I drink kefir:

This is especially interesting because the only previous date when my gut saw any of this taxa was in December – on another occasion when I drank some kefir. In fact, *Fusicatenibacter* is such a strong predictor of kefir drinking that I can use it as a way to look back in time to see the samples when I drank some.

How common is *Fusicatenibacter* in gut microbiomes? Here's a density plot look at a few hundred samples collected from other people.

<sup>&</sup>lt;sup>4</sup>See Zhernakova et al. (2016)

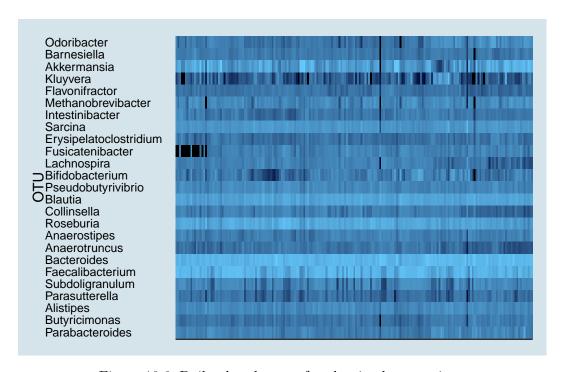


Figure 10.6: Daily abundances of each microbe over time.

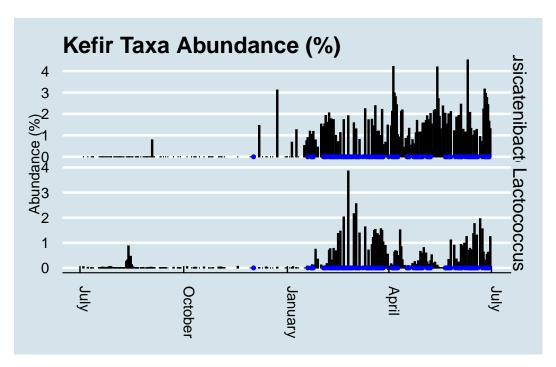
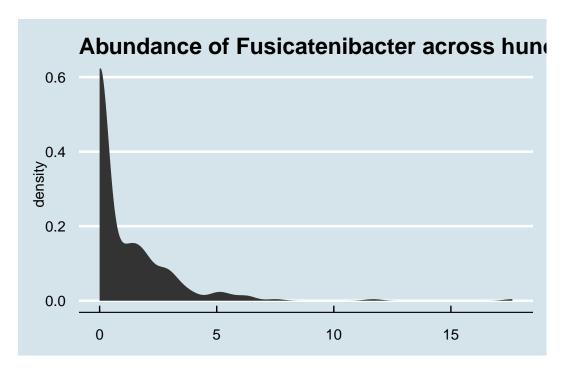


Figure 10.7: Abundance of two important genera over time. Blue dots are days when I drank kefir



Although most people have none, it's not unusual for people to have a few percentage points of *Fusicatenibacter* regardless of whether they regularly drink kefir.

But other than this clear change in my gut microbiome, did I notice any differences in health?

Here the answer is more ambiguous. As a healthy adult, I don't have any particular "problems" I'm trying to solve. I remained healthy during the period of the experiment, so the kefir certainly doesn't appear to have made anything worse. My sleep hasn't substantially changed either, and although I'm generally pretty even-tempered, I didn't notice any particular changes positive or negative in my mood either.

The one area where, subjectively, where I feel different is in my overall sense of energy. Although I can't put my finger on anything quantitative, I do notice that I seem to be a little more energetic on days when I drink kefir. Measuring that more precisely may be a good followup test.

## 10.3 Kombucha

For healthy bacteria-rich drinks that affect the microbiome, many people immediately think of kombucha. Served chilled during the summer, it has a well-deserved reputation as a natural refreshing alternative to soft drinks. Despite its tangy, mildly sweet taste, it has a surprisingly

low amount of sugar: only six grams in a serving<sup>5</sup>, compared to more than 20 grams in the same amount of orange juice or 39 grams in a can of Coke.

The sugar is missing because it's been eaten by microbes, a complex blend of bacteria and yeast that convert regular tea (usually black, but also only or green tea) into a complex, flavorful beverage. The fermentation process is ideal for adding other ingredients for taste, so there is no end to the interesting flavors possible, giving rise to a highly competitive commercial market: U.S. supermarkets sold \$180 Million of the drinks in 2015.

Kombucha fermentation begins with a SCOBY, a "Symbiotic Colony of Bacteria and Yeast", a pancake-sized disk-shaped gelitintous object also known as a "mother" or "mushroom", which it sort of resembles. Despite the nickname, the only funji in the SCOBY are yeasts, combined with a complex blend of bacteria and other single-celled microbes from many parts of the tree of life. The different microbes need one another to produce the distinctive sweet and fizzy taste. Yeast cells convert sucrose into fructose and glucose and produce ethanol; the bacteria convert glucose into gluconic acid and fructose into acetic acid; caffeine from the tea stimulates the entire reaction, especially the production of cellulose by special strains of bacteria.<sup>6</sup>

There have been many anecdotal claims of the effect of kombucha on health, purporting benefits ranging from better eyesight and thicker hair to cures for various diseases, though not everyone thinks it's healthy. Even some alternative health experts, like Dr. Andrew Weil, recommend against it. Many of the claims for and against kombucha have been studied experimentally, in mice as well as humans, often with compelling results, but I'm unable to find any good data showing how it affects the microbiome.

#### So I tested it myself.

For seven days, from July 27 to August 2, I drank 48 ounces per day of commercially-purchased GT's Gingerade Kombucha. That's three full bottles, or six servings a day for a week.

The key bacteria in the SCOBY are from phylum *Proteobacteria* and order *Rhodospirillales* of acetic- and gluconic-acid producting microbes that include genus *Gluconacetobacter*, closely related to *Acetobacter*, the key to the fermentation of vinegar. Thanks to the action of these microbes, kombucha is quite acidic, between 2.5 and 3.5 pH, almost as acidic as the 1.5 or 2.5 of a healthy stomach. These bacteria apparently don't survive ingestion. They are rarely, if ever, found in human guts<sup>7</sup>, so whatever effect, if any, they have on the microbiome is indirect.

The label claims each bottle contains one billion organisms of two microbial species. The first, *Saccharomyces boulardii*, is a popular "healthy" microbe, well-studied and proven as a safe digestion aid. A close cousin of brewer's yeast, its cell wall tends to stick to pathogens, which may account for its proven ability to prevent and fight diarrhea.<sup>8</sup>. Unfortunately, it is not a

<sup>&</sup>lt;sup>5</sup>Though one large test by the BevNet industry trade site says the labels may under-report the real amount, and in 2017 a judge approved a settlement to a class action claiming misleading sugar content by one manufacturer <sup>6</sup>The best scientific review I know is in Dufresne and Farnworth (2000)

<sup>&</sup>lt;sup>7</sup>For a list of microbes that *are* found in the gut, see: http://www.raeslab.org/companion/vlaams-darmflora-project.html

<sup>8</sup> https://www.ncbi.nlm.nih.gov/pmc/articles/PMC4542552/

bacterium, and so won't be detectable in my 16S-based microbiome tests.

The other added species *Bacillus coagulans* is often found in human guts, and should be easy to find. The specific one used in GT's drinks is the patented *Bacillus coagulans GBI-30*, 6086, a particularly hardy spore-forming microbe that can survive boiling and baking. Because it's well-studied and safe, it's a popular "probiotic" food additive and appears to have some beneficial effects on digestion.<sup>9</sup>

I tested my gut microbiome each day, as well as my mouth and skin microbiome at intervals during the experiment and sure enough, the *Bacillus* shows up loud and clear. (Figure 10.8)

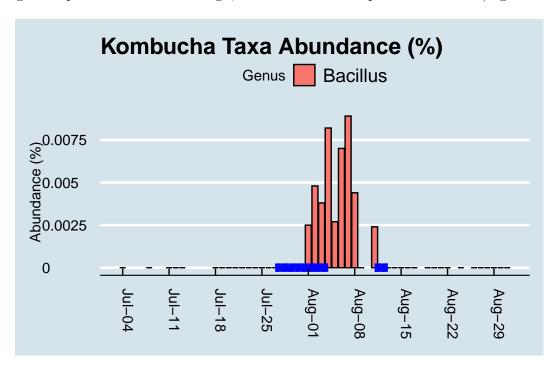


Figure 10.8: The blue line represents days I drank 6 servings of kombucha.

It took a few days of heavy kombucha drinking, but eventually those microbes became detectable. Given the known hardiness of *Bacillus*, this isn't necessarily all that surprising. Still, it's a nice confirmation that the test works; after all, in my hundreds of daily tests, I see this microbe only in the few days after drinking this brand of kombucha. But maybe the *Bacillus* just comes in and out, safely protected as a spore, without really influencing my microbiome. Can we see evidence the kombucha affected something else about my microbiome?

Diversity doesn't seem to change (Figure 10.9). I looked at the overall mixture of microbes and abundances using the Shannon diversity metric, commonly used by ecologists to tell measure the richness and variety in an environment. Don't let the scale of this graph fool you:

 $<sup>{}^9{\</sup>rm https://www.asm.org/index.php/general-science-blog/item/6761-bottoms-up-discover-the-microbes-in-probiotic-drinks}$ 

I set it narrowly to see precisely how diversity changes each day. A Shannon diversity change of a tenth of a point or so, as in this graph, is pretty trivial.

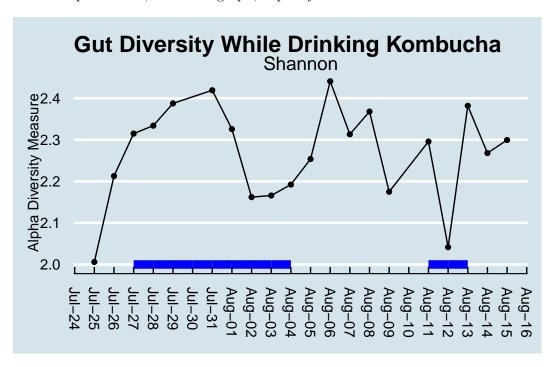


Figure 10.9: How my overall family-level diversity changes while drinking kombucha. I drank 6 full servings on each of the days marked with the blue line.

Diversity had been climbing before the experiment began, so I don't think we can lay that initial increase on kombucha. Incidentally, had I not been testing daily, I might be tempted to say diversity *decreased*. This is something that makes me skeptical of the results of many scientific studies: the microbiome flucutates so much day-to-day that what you see is very dependent on *when* you test. (By the way, note that the July 30 sample is missing, due to a failure in the lab processing.)

Let's look at that order Rhodospirillales that contains the genus Acetobacter found in the SCOBY. (Figure 10.10)

If we squint enough, we might credit that large spike with kombucha drinking. It's possible, but then how would you explain the crash the following day, or the other apparent spikes in other parts of the chart? I conclude it's probably a coincidence. More than likely, microbes like this from the SCOBY itself are not in the beverage anyway.

What about other microbes? Here is a heatmap showing the changes of the top 20 genus during my experiment (Figure 10.11)

I don't see any patterns. Usually, if the experiment causes a change, I'll see an obvious streak from left to right somewhere in the heatmap, but I don't see that.

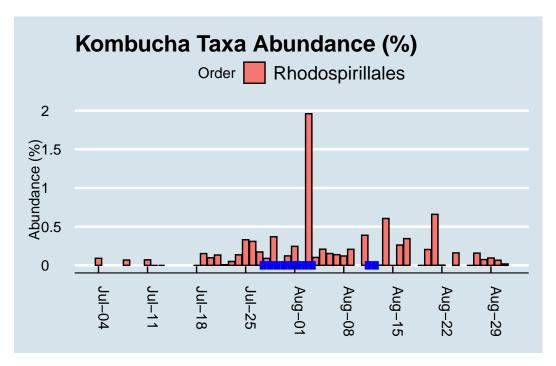


Figure 10.10: Abundance of microbes that include the genus Acetobacter found in the SCOBY

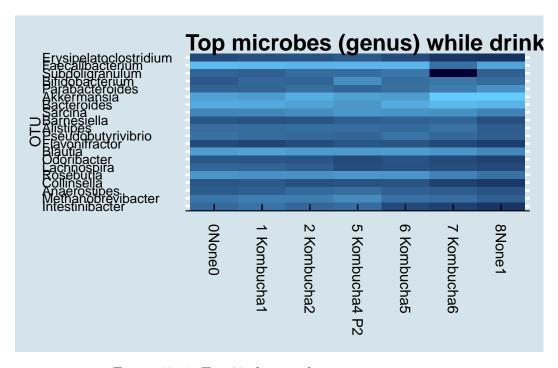


Figure 10.11: Top 20 changes during my experiment

Finally, let's look at the levels of a few "probiotic" microbes, including the one listed on the label (Figure 10.12)

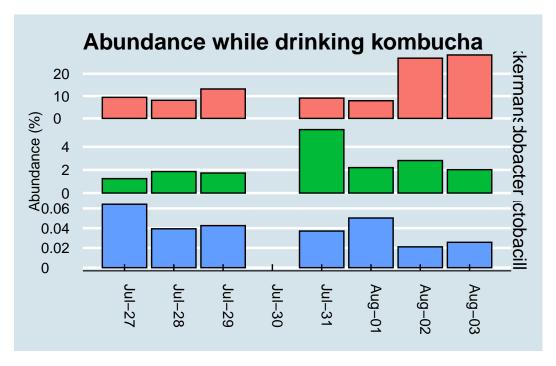


Figure 10.12: Abundance of key 'probiotic' microbes while consuming kombucha.

While Akkermansia seems to rise near the end of the sequence, it's hard to see any real patterns here.

For comparison, let's look at a longer time horizon (Figure 10.13)

Although we can't positively credit kombucha for that spike in *Bacillus* during my experiment, it's interesting that I had none of it in the weeks beforehand, and that it disappeared again in the weeks afterwards. I drink this brand of kombucha occasionally, and yes the same microbe shows up occasionally too, sometimes a few days afterwards.

In my years of testing, I rarely see *Bacillus* in my gut microbiome, but the few times when it *does* appear, there seems to be a relationship to drinking the same brand of kombucha a few days beforehand. There are also times when I drink kombucha and *don't* detect this microbe, so the association isn't perfect, but then again this was the only time I had so much of this brand all at once.

My conclusion: when consumed in large amounts, GT's Gingerade Kombucha leaves new *Bacillus* microbes in my gut. Although they don't appear to stick around permanently, the association is strong enough that I bet it works in you too. Other microbes, including so-called "probiotic" ones, don't change much at all.

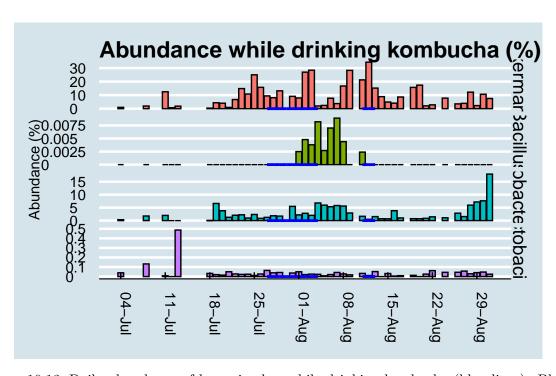


Figure 10.13: Daily abundance of key microbes while drinking kombucha (blue lines). Blank regions are days when I have no data.

But don't take my word for it. The full dataset and analysis tools are on Github: https://github.com/richardsprague/kombucha

There is much more analysis that can be done with this data. Some of the ideas you might try are:

- Study correlations among the taxa. Which ones are correlated, and which are not?
- Which taxa appeared and/or disappeared during the experiment?
- Is there a relationship between the microbes known to be present in kombucha and those in any of the gut results?
- How do these results compare to you when you drink kombucha?

Please study as much as you like, and let me know what you find!

P.S. The term "kombucha" is an unfortunate mistranslation of a Japanese word that means "seaweed tea". A fermented version of seaweed tea exists, but it has nothing to do with the drink described here.

#### 10.4 Do Probiotics Work?

Probiotic supplements are a \$55 billion business, with food and beverages accounting for almost 80% of that, according to an August 2021 report by Grandview Research. With unregulated health claims that range from the benign ("helps digestion") to the fantastic ("A miracle cure!"), do they make a significant difference in my own gut microbiome? I tested myself to find out.

Among unhealthy people, there is evidence that, under a doctor's care, probiotics can help with antibiotic-associated diarrhea and similar conditions in children or among people recovering from *C.* difficile infections.

On the other hand, a recent scientific review of all well-done studies of probiotics among healthy people couldn't find evidence that probiotics made much difference compared to a placebo in randomized controlled trials. When the data-heavy web site FiveThirtyEight did a week-long series on Gut Science, including a detailed survey of what's known about probiotics, they concluded: "There's no evidence in humans, however, to support taking probiotics just to generally improve your gut health."

A literature review by the US Agency for Healthcare Research and Quality found no safety issues in healthy adults, but there is surprisingly little research to show that the pills actually do anything. The independent lab Labdoor tests most common brands to see which actually contain the organisms claimed on the label, but I couldn't find anyone who tests whether the body can absorb them or not. There have been a few peer-reviewed studies showing that *some* microbes in supplements can make it to the gut<sup>10</sup>, but these studies almost feel like special

 $<sup>^{10}</sup>L.$  reuteri DSM 17938 and L. rhamnosus GG in Dommels et al. (2009)

cases, where they try lots of microbes and only a few make it. It's not clear that organisms in a typical off-the-shelf bottle of probiotics have ever been tested that way.

I'm especially interested in learning whether the probiotics in the supplements actually "stick" in my gut. Taking so many billion organisms in pill form all at once may very well show up in a single gut test result, but how do I know they're not simply being flushed out of my system? Or worse, how do I know I'm not just crowding out something more important?

To find out, I tracked my microbiome daily while taking a high quality probiotic supplement, one that I received directly from the manufacturer. To be a fair test, one worth publicizing the brand name for better or worse, I'd want to try it out on multiple people, at multiple times. Because I didn't do that this time, I won't name the product other than to say that it's from a "good" brand and well-recommended.

I took the supplement once per day for nine days. I would have continued for an even ten, but I was starting to feel uncomfortably bloated those last few days. While that's an encouraging sign that the pill is working, I didn't want to do anything to seriously mess up my gut. I'm doing this experiment for fun, and it won't be fun if I get sick as a result.

Let's look for at the overall abundances for the two genera that were in the supplements: Bifidobacterium and Lactobacillus. (Figure 10.14).

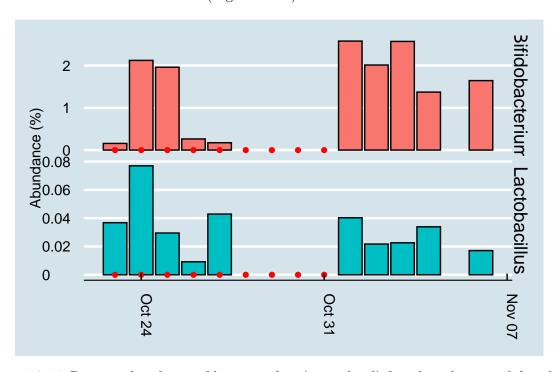


Figure 10.14: Percent abundance of key microbes (genus-level) found in the gut while taking a probiotic supplement.

The red dots represents days when I took a gut sample after consuming the probiotic. Unfortunately, despite taking and submitting samples daily, several of my results just didn't have enough reads to be useful. This chart shows only the days when I have a sample of at least 10,000 reads.

Even with that caveat, it's hard to see clear-cut evidence that the pill had a significant effect. Yes, I have slightly more of those two taxa by the end of the experiment, but seriously, not that much more.

Let's look at a longer time horizon (Figure 10.15).

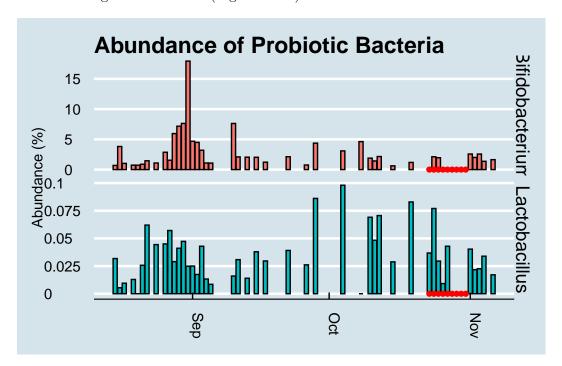


Figure 10.15: Percent abundance of key gut microbes over a three month period after taking a probiotic supplement.

Hmmmm, it seems the levels of those particular genera did increase a tiny bit at the end of the experiment, but there are plenty of other times on the chart where I see spikes too. In fact, the biggest increase happened in September when I was living it up in New Orleans, eating red beans and rice – and no probiotic pills.

Maybe my view of the microbe ecology, hoping to see results in only one or two genera, is too simplistic. We know that the gut is an ecosystem. If you add lots of one type of organism, maybe that affects the abundances and ratios of other microbes, all of whom are in constant competition with one another. Is there a way to tell *overall* how the microbes are changing?

Let's apply an *ordination* analysis. Essentially this means we look at all the samples together and work out how different the samples are from one another, based on some "distance metric"

that compares the abundances of specific microbes. If the abundances of two samples are roughly the same, or if they tend to rise and fall together, then we plot them next to each other, and vice versa if they are not well-correlated. There is a mathematical way to do this where we combine all these different correlations over and over and pick just the two that seem to matter the absolute most, which we'll plot on a two-dimensional graph (Figure 10.16)



Figure 10.16: NMDS ordination (Bray-Curtis) of gut samples for ten months before and after taking probiotic supplements.

Hmm... that looks pretty random to me.

### 10.4.0.1 Other people

Since doing this experiment on myself, I've spoken with numerous others who've tried something similar: take a gut test, then start some type of probiotic supplement, and finally take another followup test a few days or weeks later.

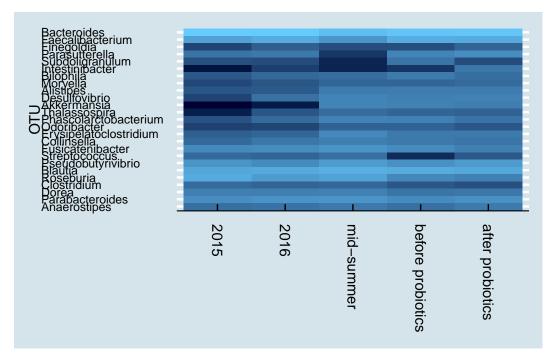
Here's an example, "Jeremy", a healthy man in his 50s took this probiotic supplement: \$42 for one month of pills:

and here's the high level result:

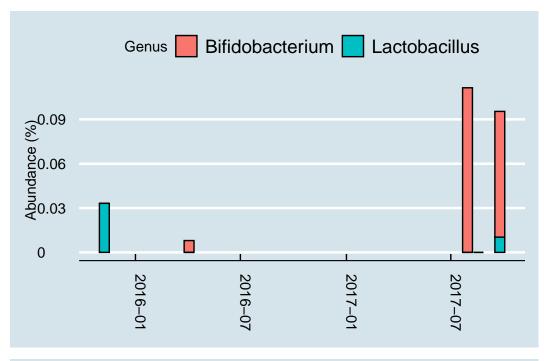


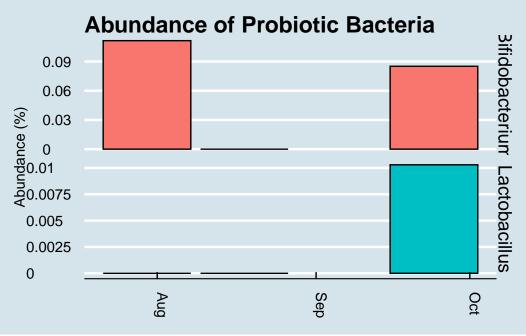
OTHER INGREDIENTS: Potato starch, silicon dioxide, stearic acid, ascorbic acid, and hydroxypropyl methylcellulose.

Figure 10.17: Super Bifido Plus Probiotics contains high amounts of live Bifidobacteria and Lactobacillus.



Next let's look just at the microbes reported to be in the probiotic pills. Jeremy has three samples of interest: (1) taken in mid-summer, a month before starting the probiotics, (2) right before the month of pills, and (3) after completing 30 days of faithful pill taking.



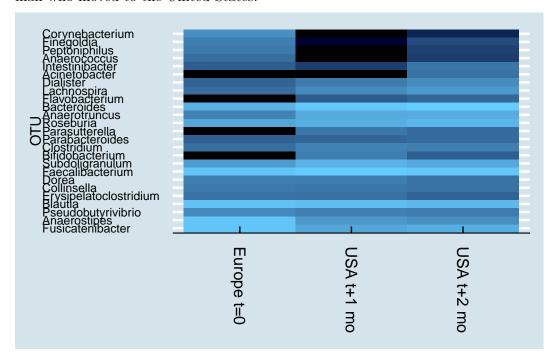


So although we do see a slight increase in both taxa, it's hard to pin it solely on the probiotics. After all, he was at even higher levels a month before starting the pills.

Also, looking more closely at the read counts, I see that the final sample had the lowest, about

36,000 reads versus the 80,000+ reads of the other samples. When dealing with low-abundance bacteria, this can matter, but it's impossible to tell precisely how much. The bottom line is that it's possible that the probiotics had no effect whatsoever, and even if there was an effect, it was probably quite slight.

In fact, probiotics appear to have less of an effect even than travel. Here's "Kevin", a European man who moved to the United States.



Notice how Kevin's microbiome shifted dramatically a month after arriving in the US. Soon after that, he began taking a probiotic supplement, but his gut – while different – hasn't shifted as much as it did from the international move.

#### 10.4.1 VSL

The most tested probiotic is VSL#3, and recently a woman sent me her microbiome test results after taking Optibac for 4 days prior to her second test. (Figure 10.18).

In this case the abundances of these microbes went up significantly. Is that a coincidence? Hard to tell from a single sample, but perhaps this probiotic is one that makes it through and shows up in the results.

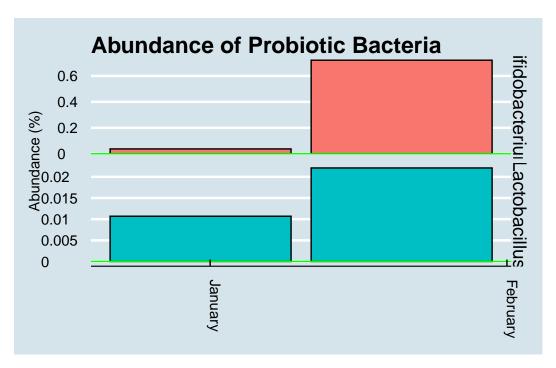


Figure 10.18: Change in key microbe levels after a course of VSL#3

#### 10.4.1.1 (Tentative) Conclusions and next steps

It is very difficult to say with this analysis that the probiotics had any effect that is detectable by the uBiome Explorer test.

Further analysis required:

- Consider other statistical analysis. Although the two strains contained in the probiotic pill don't appear to cause a change in the gut microbiome results, are there other changes that can be detected statistically. Perhaps there are other taxa that show a significant change.
- Other time horizons. Maybe the changes don't happen immediately. Although at a high level, there doesn't appear to a noticable lag in the levels of the probiotic strains, perhaps a more sophisticated data transformation would uncover something.

## 10.5 My Oral Microbiome\*

The first place that microbes enter is also one of the richest and most variable environments in the body.

Scientists added an odorless compound from wine to a culture of known oral bacteria, and sure enough: the bacteria generated compounds that we can smell: terpenes, benzenic compounds and lipid derivatives. Each of us has a unique oral microbiome, and scientists were able to that that this inter-person variability is large enough to explain at least some of the differences in how each of us perceive a glass of wine.

What are the most important species in my mouth?

To microbes, your body looks like a hollow tube: skin on the outside, gut on the inside, and a mouth to allow passage between the two. Like purgatory, the mouth is a gatekeeper where new microbes wait before being whisked into the heavenly warm breeding grounds of the digestive system. But it's no easy waiting room either-the mouth contains many highly-distinct eco-systems, each as different from one another as the Sahara desert is to the bottom of the ocean. Most microbiome and genetic tests ask you to swab the inside of the cheek-an easy, straightforward place teeming with bacteria, but the bacteria in the cheeks can be very different from those on the tongue or the lips. I tested them all one morning right after waking up.

	Lips	Tongue	Cheek (Right)	Cheek (Left)
Streptococcus	57.36	6.44	38.41	43.42
Haemophilus	19.61	4.97	6.36	7.59
Gemella	8.47	2.23	10.67	12.64
Actinobacillus	3.07	0.26	3.91	3.32
Veillonella	2.14	7.70	1.81	2.20
Granulicatella	1.60	0.88	2.13	2.36
Neisseria	1.47	14.91	7.51	4.12
Fusobacterium	1.24	14.99	5.94	6.96
Porphyromonas	1.10	3.37	3.56	2.78
Rothia	0.90	0.21	6.49	2.83
Actinomyces	0.69	2.26	2.90	2.11
Prevotella	0.45	13.31	1.09	1.73
Alloprevotella	0.42	2.76	0.46	0.36
Leptotrichia	0.22	8.20	1.64	1.96
Capnocytophaga	0.20	3.87	0.59	0.64
Pasteurella	0.10	0.02	2.28	0.87
Lachnoanaerobaculum	0.04	1.19	0.09	0.19
Campylobacter	0.03	2.05	0.39	0.50
Johnsonella	0.02	1.43	0.07	0.12
Bacteroides	0.00	0.00	0.95	0.23

Dramatic differences in the types of microbes in each part of the mouth.

While there is some variation in the cheeks, there is a dramatic difference between them and the lips or tongue. Also interesting is the way the lips are dominated by just three taxa that make up more than 85% of the total abundance. In Inverse Simpson terms, the lips are the least diverse, whereas the tongue is the most diverse.

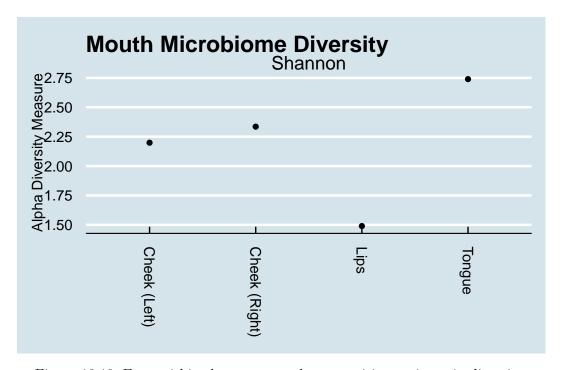


Figure 10.19: Even within the same mouth, a surprising variance in diversity.

Regular testing of my microbiome often yields unexpected surprises, and this one has me stumped. Beginning in December 2016 and for no apparent reason, my mouth was colonized suddenly by a particular species of *Streptococcus* that had not been there before. Why? I'm not aware of any major lifestyle or other changes to cause this: same toothpaste, same living conditions. A few dietary experiments here and there, but nothing that coincides with these changes.

At the species level, I eliminated all samples with under 10,000 reads. We see something interesting: for no apparent reason, the species of *Streptococcus* detected in my mouth has changed. Suddenly, in December 2016 my mouth was colonized by a particular species that had not been there before. Why? I hadn't done anything special; I'm not aware of any major lifestyle or other changes to cause this.

I confirmed with the lab that it's not contamination. What's especially odd is that I experienced a shift like this twice now in one year. After comfortably floating along with Species Streptococcus sp. BS35a for more than six months, suddenly in August the balance shifted again, this time to Streptococcus sp. 11aTha1. Will it shift again? Who knows?

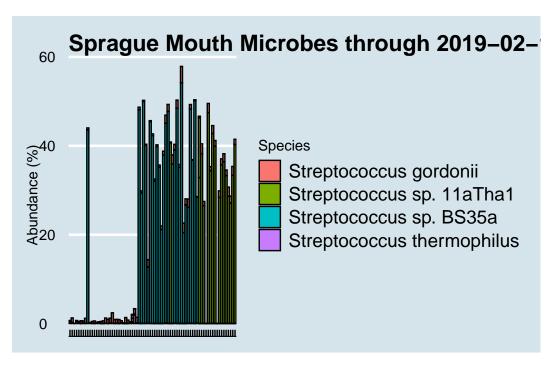


Figure 10.20: Odd shifts in some streptococcus species over time.

I confirmed with the lab that it's not contamination.

What's especially odd is that I experienced a shift like this twice now in one year. After comfortably floating along with Species Streptococcus sp. BS35a for more than six months, suddenly in August the balance shifted again, this time to Streptococcus sp. 11aTha1. Will it shift again? Who knows?

Earth's atmosphere was originally void of oxygen, a poisonous gas to the first, so-called "anaer-obic" bacteria who thrived precisely because there was no oxygen. Over eons, as oxygen levels increased these microbes found places to hide: deep, dark pockets inside multicellular creatures who traded an oxygen-free interior for the abundant, exotic metabolites the microbes could synthesize. In humans, these bacterial safe-houses begin in the mouth, where the oxygen is low enough to keep the lights on for the anaerobes, while allowing occasional blooms for the aerobic bacteria that thrive whenever the mouth is open and they find fresh air.

Most of them do apparently need moisture: your salivary glands, strategically located in your cheeks and at the bottom of the mouth, churn out 1–2 liters of saliva per day.

The complexity of the mouth microbiome is compounded by the variety of surfaces, hard and soft, each with its own propensity to allow the formation of biofilms, tenacious clusters that protect microbes against invaders. On teeth, we call it dental plaque, a favorite protective breeding ground of *Streptococcus mutans*, the cavity-causing villain that, once established, is hard to dislodge. I'm fortunate that my mouth microbiome appears to have none of this and

it's true that I never have cavities. I've seen levels as high as 2% in some people, who have to visit the dentist no matter how much they brush.

Most microbes go down the hatch to the stomach, of course, but overly-aggressive tooth brushing or dental work can let a few can sneak into the bloodstream directly, where they can find their way to the lungs, the liver, or the heart, sometimes with deadly consequences. The "viridans" streptococci are one well-studied example: beneficial in the mouth, they outcompete other streptococcus enough to prevent strep throat, yet are the leading cause of heart valve infections if they make it into the bloodstream.

These mouth microbes have other interesting properties that may affect much more than we think. When scientists added an odorless compound from wine to a culture of known oral bacteria, the bacteria generated compounds that we can smell: terpenes, benzenic compounds and lipid derivatives.<sup>11</sup> Each of us has a unique oral microbiome, and the experimenters were able to show that this inter-person variability is large enough to explain at least some of the differences in how each of us perceive a glass of wine.

So what about these odd new ones that showed up in my mouth?

I've looked up their names in every reference I can think of, but have found nothing. That's not too surprising: about a third of oral microbes are known only by their gene sequences. <sup>12</sup> The most satisfying answer from a microbiology expert I consulted is that these are likely to be "passenger microbes", doing nothing in particular helpful or harmful.

In other words, like so many other microbes in our environment, they are just along for the ride.

## 10.6 Visiting the dentist

The gut biome is interesting enough, but bacteria colonize just about every part of the body, so here's an experiment to measure the mouth bacteria and how the varieties shift after a visit to the dentist.

The mouth harbors its own unique ecology of bacteria, much of which is entirely unexplored. Scientists from the Forsyth Institute in Boston are at the cutting edge of the research, and have characterized many of the species found in their test subjects mouths, but widespread human trials are still years from producing the kinds of results we see from the gut biome research.

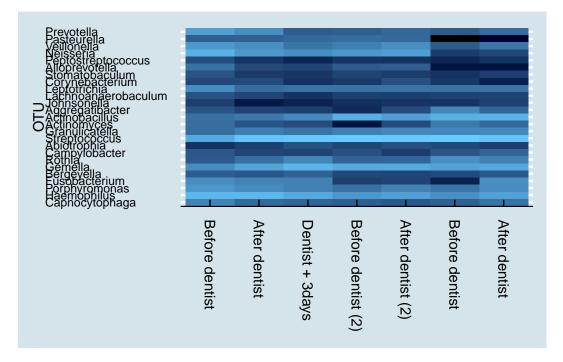
So far the research is clear that many cavities are associated with one nasty species: Strepto-coccus Mutans. This bug contains receptors that adhere to the surface of the tooth, creating a slimy biofilm where, under the right conditions they breed rapidly. Interestingly, just a few

 $<sup>^{11}</sup>$ Muñoz-González et al. (2015)

<sup>&</sup>lt;sup>12</sup>https://www.nature.com/articles/sj.bdj.2016.865.pdf

hundred bacterial cells is enough for it to begin its work, feeding on glucose to create a reaction that combines with the tooth enamel to form plaque. The ever-present lactic acid in the mouth, a critical component of pre-digestion, reacts with the plaque to remove calcium from the tooth, leaving small, ever deepening holes that will destroy the tooth unless the dentist intervenes with a filling.

I visit my dentist in April and October each year, and I measure my mouth biome before and after each April visit. Unfortunately I don't have before/after for the October samples, but I do have a sample taken a few days afterwards. Let's look at an overall heatmap picture of all the dentist-related mouth samples:



These are five samples taken over the course of one year, when many things can change. Nevertheless, the differences between the before/after samples is strikingly obvious. Despite being sampled only a day apart, there is clearly a major shift in the mouth microbiome after a dentist appointment and cleaning.

Here's a more numerical breakdown at the genus level of the top ten microbes and their abundances before and after first visit:

	% before	% after
Haemophilus	22.3237	23.0557
Neisseria	17.9975	6.2514
Streptococcus	13.4156	36.0979
Prevotella	8.8309	3.9503

	% before	% after
Veillonella	6.5300	4.3380
Porphyromonas	6.1201	3.6216
Leptotrichia	4.1791	0.9552
Fusobacterium	4.0991	2.5904
Gemella	3.8491	9.7999
Capnocytophaga	2.6722	0.8850

The most abundant taxa, *Haemophilus*, stays relatively stable, while abundances of the second two taxa *Streptococcus* and *Neissaria* seem to switch places. The other taxa in the top ten also seem to drop in abundance, except for *Streptococcus* and *Gamella*.

Anything in the genus *Capnocytophaga* is an opportunistic pathogen, so I say good riddance. Usually they're fine, but if your immune system dips they can turn bad.

To understand more precisely what changed, let's look more closely just at the ones that disappeared:

	% before
Centipeda	0.0614
Chryseobacterium	0.0385
Bilophila	0.0057
Bacteroides	0.0042
Dialister	0.0028
Akkermansia	0.0028
Blautia	0.0028
Stenotrophomonas	0.0028
Mycobacterium	0.0028
Delftia	0.0028

All of these unique microbes are of such tiny abundances that it's hard to rule out simple contamination or other problems with the sampling. Still, it is interesting that there was nothing new (at the genus level) in the "after" sample that wasn't in the "before". This is consistent with the expectation that a dental cleaning would, if anything, tend to *remove* taxa rather than introduce any new ones.

But that was just for a single dental visit. What happened when I repeated the experiment the following year?

	% before	% after
Streptococcus	45.8502	43.1782
Actinobacillus	15.7059	8.5416
Gemella	13.3460	13.3400
Haemophilus	6.4258	8.7729
Neisseria	6.2026	8.4911
Granulicatella	2.3758	3.2374
Veillonella	2.2163	4.2491
Leptotrichia	1.3154	1.3874
Porphyromonas	1.2118	2.5798
Pasteurella	1.0204	0.8744

Interestingly, this time my most abundant taxa is Streptococcus, instead of Haemophilus.

Like last time and as expected, I found no new taxa *after* the cleaning, but here are the genus-level items that disappeared, all at such low abundances that we should probably chalk them up to contamination or other errors that creep in unavoidably between the time I take the sample and when they show up in my results.

	% before
Moryella	0.0558
Stenotrophomonas	0.0318
Mycobacterium	0.0239
Centipeda	0.0239
Candidatus Saccharimonas	0.0159

Let's start with the genus level. How much *Streptococcus* has been in my mouth, and to the degree that we know at the species level, which types of species are there?

Hmm, lots of different species here. But what about the cavity-linked *S. Mutans*? It turns out that I do have a tiny bit, but in just one sample long ago. And sure enough, my dentist confirms that I have no cavities.

Keeping *S. Mutans* at bay is an important way that I'll try to avoid cavities, so to continue the experiment, I'll look at what I can do to manipulate the mouth biome, beyond what I eat and drink. A key part of that is how I brush my teeth.

Like most Americans, for years I brushed exclusively with one of the name brand toothpastes, usually Crest or Colgate. But looking more closely at the labels, I see two ingredients that will be of interest to my oral microbiome: triclosan<sup>13</sup> and sodium lauryl sulfate, both of which are

 $<sup>^{13}\</sup>mathrm{Note}$  that Crest hasn't used this in its products since 2014

are known to affect microbes. In addition, the fluoride in the paste works partly by making the tooth enamel more difficult for bacteria.

Pre-modern humans didn't have toothpaste, and certainly not the antimicrobial kinds that have become popular only in the past generation. Of course, tooth decay was a painful reality for many of our ancestors as well, but there is good evidence that serious teeth problems didn't begin until the widespread availability of sugar after the European immigration to America five hundred years ago. Skulls of humans before agriculture show almost no tooth decay. Wild animals, including primates like gorillas and chimpanzees get far fewer tooth problems than modern people, another clue that teeth brushing isn't the whole story.

Could it be that a healthy mouth requires a healthy diversity of bacteria, including versions of Stroptococcus that out-compete the cavity-causing kinds? But toothpaste with triclosan and other anti-microbials are wide-spectrum: they don't target just the "bad" cavity-causing organisms. They also kill other species needed for digestion, or to control bad breath.

To find out more about whether oral diversity is a good or bad thing, for my continuing mouth experiment I changed toothpaste. Rather than continue with one of the leading fluoride brands, I switched to a more "natural" brand whose ingredient list does *not* contain antimicrobials.

#### 10.7 Conclusions

Are these results are meaningful enough to be worthy of further analysis? How representative were these samples of my microbiome at the time? I submit only a tiny swab to uBiome's lab; are the bacteria distributed evenly enough that the size or location of the sample doesn't matter? Would I get similar results if I submitted two tests from slightly different sites on the same sample?

The answers to all these questions are unclear, but while we need to take these concerns seriously, my experience over many samples is that the uBiome results are consistent enough that, yes, the conclusions are actionable as long as we keep the limitations in mind. Here's why I think so:

First, my results are consistent with other "healthy omnivore" submissions that uBiome has received from others with diets and health histories similar to mine. I would be concerned if, for example, my firmicutes/bacteroidetes ratio were reversed.

Second, 16S technology has proven accuracy when identifying unique organisms, so I can generally trust information about the overall level of diversity regardless of specific proportions. Since diversity tends to correlate with health – and is manipulable based on what I eat – my own experience shows that the changes I see in these results go up and down consistently in the expected way. Even if specific points on my microbiome map are fuzzy, the overall landmarks appear to be solid.

# 11 DIY Microbiome Testing

Although I've done hundreds of near-daily microbiome tests in the past, these days I only test myself every couple of months. Here are my recommendations as of early 2023.

If you're just curious to see the results, I recommend signing up for one of the free clinical studies that will send you a gut kit and report the results:

- The MACO study from Endominance wants to understand the relationship between the microbiome and anxiety. Fill out a 100-question survey to get a gut test kit. They'll pay you \$40 and give you your results when you're done.
- NYUFamili gives you a \$25 gift card for completing a questionnaire and emailing a gut sample.

If you're more serious and want to get a detailed breakdown of the microbes, I recommend either:

- Ombre, which for \$100 will give you a very broad ("16S") look at your gut microbiome.
- Tiny Health (\$200), which though specializing in infant and women's health, offers a good general-purpose high-quality report for adults as well.



Figure 11.1: A few good microbiome tests from 2023

Many people are looking for a test that will help them with a diet, either to lose weight or to solve some other gut-related issue. In that case, I would look at:

- Zoe (\$250), which includes a very readable report, plus an app that helps you target specific foods and amounts. (See my detailed review)
- Viome (\$300), including a blood and saliva test based on their "transcriptomics" technology. You'll get a ton of information, mostly related to food suggestions.

If you're suffering from a specific ailment that you'd like to consider for a microbiome-related treatment, I strongly suggest you see an expert. Search your local area for "digestive" or "gut" doctor, or for a condition like "IBS" or "SIBO". Go with doctors who use tests from Doctors Data or GI MAP from Diagnostic Solutions. Unfortunately there is wide variation in quality among gut doctors, so you'll need to shop around, and hopefully get a referral from somebody you trust.

A University of Oslo dietician at MyMicrobiome did a thorough feature summary of microbiome tests available in Europe. While not all of the tests are available in the US, it's a good breakdown of what to look for in these tests.

# Part V Next Steps

# 12 Beyond Bacteria

While technically the microbiome refers to all microbes in and around us, most of the everyday usage of that term is limited to bacteria. But bacteria aren't the only microbes in you, and it's possible that they aren't even the most important. There are fungi, of course, and perhaps other too-tiny-to-see lifeforms like protozoa, but one large class of microbes appears to have a major effect on us but is rarely studied: viruses.

Viruses present several problems for scientists. They're super-tiny for one: you can often fit hundreds of virus-sized particles inside a single bacterium. They're not always made of DNA, and even when they are, they don't reproduce on their own. The controversy about whether they should even be considered "alive" is partly due to this lack of reproduction ability, but also because many of them appear to be quite simple: just a sequence of proteins.

These characteristics wreak havoc with the traditional scientists' toolkit for dealing with small objects: they're too small to study optically without powerful equipment, and their lack of a reproductive mechanism means you can't easily amplify their quantity, and their RNA components are unstable and difficult to work with. It's so much easier to deal with bacteria.

But thanks to some ingenious and difficult work, a few things are clear.

Viruses, like bacteria, are everywhere. In fact, just about every human on earth is infected, right now, with dozens of them.<sup>1</sup>

Unlike bacteria, viruses are so tiny that they can slip through cracks in the body that would normally stop bigger pathogens. The placenta, for example, can pass viruses like rubella (German Measles), cytomegalovirus, HIV, and Zika.

Some viruses may actually be good for us. The ratio of viruses to bacteria is higher on the body's mucosal surfaces, such as in the gut or the nose, perhaps because these viruses (called phages) are programmed to attack pathogenic bacteria before they make it through the mucosal lining.<sup>2</sup>

A virus that circulates in your body is considered "latent" if you appear to be none the worse for it, but it's hard to tell if that's ultimately good or bad. Humans have been studying viruses for only a few decades, but viruses have been studying *us* for, well, forever. The chromosomes of virtually every organism on earth shows the tell-tale signs of viral interference.

<sup>&</sup>lt;sup>1</sup>Virgin (2014)

<sup>&</sup>lt;sup>2</sup>Barr et al. (2013)

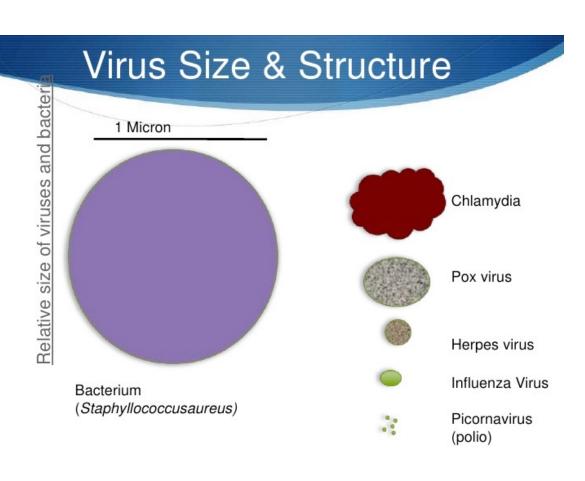


Figure 12.1: "Viruses are tiny compared to bacteria. Image:marneechua"

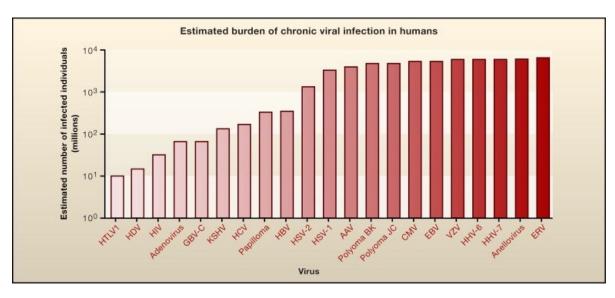


Figure 12.2: "You already have an infection with these viruses. Herbert Virgin at 2015 NIH Dyer Lecture"

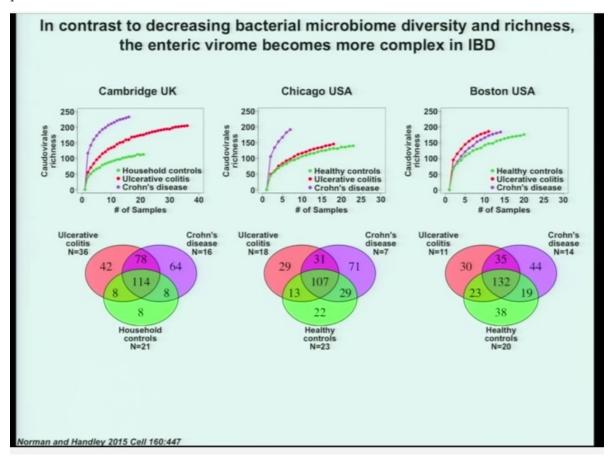
Latent viruses may not cause any obvious symptoms, but they continue to hijack cells, vigorously making copies of themselves, inhabiting every nook and cranny of the body while waiting for something to happen. In mice, and presumably humans, it's been shown that a particular type of listeria infection is inhibited when a formerly-latent virus gets word that the bacterium is in the body. The listeria pathogen ordinarily causes terrible disease symptoms, but in the presence of a latent herpes virus, nothing happens.

The nasty helminth worm, scourge of the tropics and an enemy of humans since time immemorial, actually wakes up the latent herpes virus, which has a sensor fine-tuned to detect it, in turn causing another reaction that will shut down the helminth again. If the virus is not present, guess what: the worm goes about its awful parasitical business; but with the virus, nothing happens. So which is worse: herpes virus or a helminth infection? Best, apparently, is to have both. Trouble awaits the body who has only one or the other.

This is true all over evolution and it may explain why some studies are frustratingly hard to reproduce. An experiment that works in one lab, with the same type of animal with the same food, doesn't work in another lab, no matter how carefully they try to make the experiments identical. Maybe the only difference is that one location happens to have a geographically-specific virus lurking about, and that is just enough to activate a cascade of reactions that nullifies the experiment. What a pain.

Much popular microbiome advice suggests that *more* diversity is better, and intuitively it makes sense that a body with a variety of different microbes has a more robust defense system than somebody with a more restricted microbiome. Whether this is always true among bacteria is open for debate — I for one think it matters a lot *which* microbes you have, rather than

the variety alone — but in the virome there is evidence that *more* diversity causes more problems.



IBD and Crohn's patients who were carefully studied alongside healthy controls appear to have a wider variety of viruses in their systems. It's too early to say whether this has any implications for treatment, but it does point out that the story is more complicated than we'd hope.

Similarly, the virome of colorectal patients is so different from healthy people that researchers suspect the cascade of events leading to cancer may be triggered by differences in the way phages affect gut bacteria, and not the bacteria themselves. Furthermore, the phages seem to act as a community, making it unlikely that a single culprit starts the process. Rather the cancer results in some unknown, impossibly complex disturbance in the community as a whole.<sup>3</sup>

In fact, if you're not super careful to control for the variety and types of viruses present, it could be that taking a probiotic could be harmful. Your body may have a perfectly good

<sup>&</sup>lt;sup>3</sup>Hannigan et al. (2018)

reason that a particular, otherwise beneficial microbe is missing or lower in quantity than in comparable healthy people. Introducing a bacterium that reacts with a latent virus could actually cause more harm than good.

There's no solid evidence for this yet, but if true, it points in the same disturbing direction for treatment that we've been afraid to admit all along: the best way to treat any disease is through ordinary food. Don't go messing with microbes unless you know what you're doing.

#### 12.0.0.1 The gut phageome

About half of all people appear to share at least some of a core group of phages, leading some scientists to speculate that, beyond the microbiome may lay a "Healthy gut phageome" (HGP). Another group of phages seems to be much rarer, occuring generally in people of various disease states. Could it be that it's the *phages*, not the microbes themselves that drive some types of disease?<sup>4</sup>

<sup>&</sup>lt;sup>4</sup>see Manrique et al. (2016) full text)

## 13 Microbes and Genes

There is growing evidence that your human genes affect which microbes you'll host.<sup>1</sup> If you have your 23andme results, click through on the following links to see what your own genes are.

#### Secretor FUT2 allele

https://you.23andme.com/tools/data/?query=rs601338 If you are AA, then the good news is you are immune to norovirus but the bad news is you don't digest fiber efficiently, which obviously changes the types of microbes you'd collect. With more data, we'd figure out which types of fiber work and which don't in people like this. I know several people who are AA and have serious health issues — I'm convinced with this knowledge we'd just need to find the right (probably very weird) diet for them.

This gene correlates highly with *Bifidobacterium*.<sup>2</sup>

#### **HLA-B27**

https://you.23andme.com/tools/data/?query=rs6919835

If you have A, you're more predisposed to autoimmune conditions (like multiple sclerosis) but it's believed the inflammation itself is caused by *Klebsiella* bacterium, of which interestingly I'm one of the very few people who shows any in their uBiome results. So am I immune to MS? Or if I somehow transmit my *Klebsiella* to an A carrier, could I infect them with MS?

#### caffeine

https://you.23andme.com/tools/data/?query=rs762551

I'm AC, which means I'm a slow metabolizer. 23andme thinks that I should stay away from coffee for that reason, but it's not true! I drink as much as I like with no effects on sleep, and meanwhile uBiome's functional KEGG test shows I'm 3x more efficient at caffeine metabolism than other people. Why? Because I must have a bug that does the work my genes don't. Finding that one would be pretty cool.

#### Lactose intolerance

https://you.23andme.com/tools/data/?query=rs4988235

<sup>&</sup>lt;sup>1</sup>For example see Lim et al. (2017)

<sup>&</sup>lt;sup>2</sup>See publications by Pirjo Wacklin including: Wacklin et al. (2014) and Wacklin et al. (2011)

I'm A/G, but people who have a T variant are likely to be lactose intolerant.

#### HNF4A: diabetes risk in Asians

https://you.23andme.com/tools/data/?query=rs4812829

This one's been proven in mice to be regulated in part by microbes.<sup>3</sup>

The site xcode.in has a summary of useful sites for getting the most out of your raw data

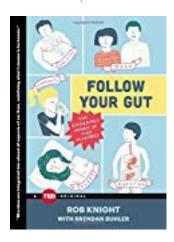
The website Genetic Life Hacks has another list of 23andme SNPS that relate to the microbiome.

<sup>&</sup>lt;sup>3</sup>see this study: http://genome.cshlp.org/content/early/2017/05/16/gr.220111.116.abstract

# 14 My favorite books about the microbiome

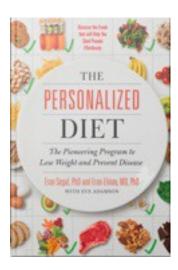
The number of books about the microbiome have exploded in the past few years, but I've tried to read (or at least skim) every book I can find. If you're a newcomer who would like to come up to speed, here's my ranked list of the best books as of today (early 2020).

• Knight, Rob Follow Your Gut: How the Ecosystem in Your Gut Determines Your Health, Mood, and More



At only 120 pages, this is the most concise summary of what's known — and not known — about the microbiome. Written by one of the scientists behind the American Gut Project, it's a readable and fascinating overview of the facts and a great first introduction. If you only read one book, this is it.

• Segal, Eran The Personalized Diet: The Pioneering Program to Lose Weight and Prevent Disease



No two bodies respond to food the same way, and the scientists who discovered some important links to the microbiome have written the most actionable, microbiome-informed book I know about weight loss and diabetes prevention. Focusing on glucose response, they describe their most famous experiments in easy-to-read but well-informed scientific language. Learn why artificial sweeteners aren't good for you, why averages are a poor way to choose your diet, and simple tricks to measure precisely what will work for you.

• Gilbert, Jack Dirt Is Good: The Advantage of Germs for your Child's Developing Immune System"



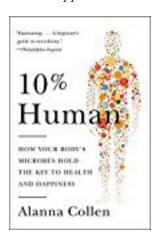
The most practical, up-to-date book on what works and doesn't work. Written for parents as a guide to ensure a child's microbiome is as healthy as possible, you'll find dozens of yes/no practical answers to everyday questions: "Should we get a dog?" (yes), "Are GMOs safe?" (yes), "What works for diaper rash?" (probiotic yogurt) and much more. Because, as the book points out, the microbiome changes little after about age three, most of the advice is general enough to apply to adults as well.

• Spector, Tim The Diet Myth: Why the Secret to Health and Weight Loss is Already in Your Gut



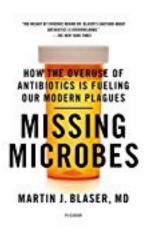
Another excellent one written by a practicing scientist and a good complement to *Follow Your Gut*. The author's concise writing style packs multiple interesting examples and facts on each page. Divided into chapters based on type of food, I learned about what's proven and what's unknown about the effects of different diets on health.

• Collen, Alanna 10% Human: How Your Body's Microbes Hold the Key to Health and Happiness



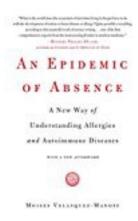
Another great overview that explains to the ordinary person the implications of the microbiome. Well-written, full of interesting facts, but sticks strictly to mainstream science. For example, although the author explains the concept of "leaky gut", she observes it skeptically as an unproven hypothesis, rather than jump whole-hog into diagnoses. Best parts discuss the gut role on behavior ("Mind Control"), with detailed examples from autism research, Whipple's Disease, and more. The book includes a list of the highest-quality references, but unfortunately it's not complete, so many of the facts are hard to follow up.

• Blaser, Martin Missing Microbes: How the Overuse of Antibiotics Is Fueling Our Modern Plagues



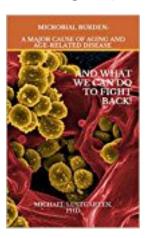
The author is a long-time, highly-cited microbe researcher who did much of the original work on *Helicobacter pylori*, the stomach bacterium implicated in ulcers. But studying these germs up close for so long has made Dr. Blaser much more nuanced about what constitutes "good" and "bad". Quoting the Inuit, "Wolves keep the caribou healthier", he makes the case that many modern ailments like allergies or diabetes maybe caused by the *lack* of microbes, not their presence.

• Velasquez-Manoff, Moises An Epidemic of Absence: A New Way of Understanding Allergies and Autoimmune Diseases



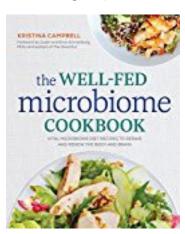
Another book that explains a provocative idea that our immune systems need regular stimulation by parasites and other infectious agents, or we risk unpleasant side effects in the form of allergies, diabetes, and many other nasty conditions. The remarkable correlation between the hygiene of modernity and the rise of autoimmune diseases makes for powerful evidence that science is far behind in understanding all the consequences of our current lifestyles.

• Lustgarten, Michael Infectious Burden: The Cause Of Aging And Age-Related Disease



## 14.1 Other Books Worth Having

• Campbell, Kristina The Well-Fed Microbiome Cookbook



If you'd like a shorter, summarized version of the science as well as practical suggestions for family meals, get this book. The author writes for gutmicrobiotaforhealth.com, which you should check for more up-to-date information.

• Axe, Josh Eat Dirt

I was surprised at how much new and practical information was packed into this book. Although the author is not a practicing scientist himself, he summarizes new ideas efficiently and I learned much about medicinal plants, non-Western treatments, and essential oils.

### 14.2 Other

Just about any new health book from the past few years will touch on the microbiome, but I didn't find much specifically microbiome-related that was useful or new in books by David Asprey ("The Bulletproof Diet"), Tim Ferriss' Four Hour Body, or Chris Kresser's Paleo Code. You may find these books useful for other reasons, like the detailed discussions of specific foods, but you'll learn little about the microbiome.

# 15 Best Academic Papers

If you're new to the microbiome and would like to dig into the academic papers that drive the field, here's the selection that I consider required reading.

Microbiome science is in its infancy, but its enormous potential makes it an environment rich in highly speculative research, often with results that are overturned rapidly with new discoveries. So before you read anything else, I encourage a peek at this 2014 Nature article by Harvard epidemiology professor William P. Hanage: Microbiome science needs a healthy dose of skepticism

#### 15.0.1 Popular Topics

You will find several themes repeated regularly in the popular microbiome press

#### 15.0.1.1 The Firmicutes/Bacteroidetes ratio

The most recent, well-respected review Walters, Xu, and Knight (2014) Walters, Xu, Knight 2014 says flat-out:

the ratio changes between normal and obese individuals are not statistically significant overall and therefore should not be considered a general feature distinguishing normal and obese human gut microbiota across populations.

Another study (Finucane 2014) goes into deeper statistical detail to conclude the same thing.

Walters, Xu, and Knight (2014)

Walters William A.,Xu Zech and Knight Rob(2014), Meta-analyses of human gut microbes associated with obesity and IBD, FEBS Letters, 588, doi: 10.1016/j.febslet.2014.09.039

Finucane MM, Sharpton TJ, Laurent TJ, Pollard KS (2014) A Taxonomic Signature of Obesity in the Microbiome? Getting to the Guts of the Matter. PLoS ONE 9(1): e84689. doi: 10.1371/journal.pone.0084689

#### 15.0.1.2 Obesity and the microbiome

Although it's exciting to think that an obesity cure might be found in the microbiome, the most recent reviews shows that it's more difficult than originally thought. Here's the best summary Full Text (open)

@sze\_looking\_2016 Sze, Marc A., and Patrick D. Schloss. "Looking for a Signal in the Noise: I

#### 15.0.1.3 "We are only 10% human"

It's a number based on a guess dating from 1977, but finally updated in 2016:

Our analysis updates the widely-cited 10:1 ratio, showing that the number of bacteria in our bodies is actually of the same order as the number of human cells. Indeed, the numbers are similar enough that each defecation event may flip the ratio to favor human cells over bacteria.

Sender, R., Fuchs, S., & Milo, R. (2016). Revised Estimates for the Number of Human and Bact

#### 15.0.1.4 Cure/cause obesity by FMT

Several studies in mice hint that an obese microbiome can be transferred to a skinny one and vice versa:

Turnbaugh, P. J., Ley, R. E., Mahowald, M. A., Magrini, V., Mardis, E. R., & Gordon, J. I. (931. http://doi.org/10.1038/nature05414

#### 15.0.1.5 Moving Pictures

Here, we present the largest human microbiota time series analysis to date, covering two individuals at four body sites over 396 timepoints.

Caporaso, J. G., Lauber, C. L., Costello, E. K., Berg-Lyons, D., Gonzalez, A., Stombaugh, J.

Don't miss the 30-second Youtube summary.

#### 15.0.2 Academic Papers

When you're ready to go to the original sources, be careful: there are tens of thousands of studies, many of them contradictory and quickly out of date. Here are the ones I think deserve to be read first.

- Historic papers (HMG)
- Population studies (enterotype, population studies)
- Specific microbes (Akkermansia, Bifidobacterium, etc.)
- Methods

#### 15.0.3 General Overview

A detailed technical review of how scientists study the microbiome, with an emphasis on how to judge the quality of results. This is a good overview for a smart person who wants an introduction to how we know what we know.

Tyler, Smith, and Silverberg (2014) (Full Text)

Tyler, Andrea D, Michelle I Smith, and Mark S Silverberg. "Analyzing the Human Microbiome: A 'How To' Guide for Physicians." The American Journal of Gastroenterology 109, no. 7 (July 2014): 983–93. doi:10.1038/ajg.2014.73.

Here is another one:

Young, Vincent B. "The Role of the Microbiome in Human Health and Disease: An Introduction for

#### 15.0.4 Microbes and Behavior

A 2019 summary of the links between microbes and psychiatry: Ameringen et al. (2019)

Ameringen, M., Turna, J., Patterson, B., Pipe, A., Mao, R. Q., Anglin, R., & Surette, M. G.

#### 15.0.5 Historic Papers

The final paper describing conclusions of the Human Microbiome Project:

Human, T., Project, M., & Figures, S. (2012). Structure, function and diversity of the healthy human microbiome. Nature, 486(7402), 207-14. http://doi.org/10.1038/nature112.

#### 15.0.6 Self-tracking

Track as much as you can about two people for an entire year: their diet, physical activity, and microbiome; look for correlations. Conclusion: the microbiome is remarkably stable and quickly recovers to its baseline. The "Methods" section is especially interesting because it goes into detail on how to find interesting statistical results with such complicated data.

David, L. A., Materna, A. C., Friedman, J., Campos-Baptista, M. I., Blackburn, M. C., Perrot

#### 15.0.7 Diet

Looking for a good overview of studies that link various microbes to diet?

The following two papers are the best summaries:

Scott et al. (2013)

Scott, K. P., Gratz, S. W., Sheridan, P. O., Flint, H. J., & Duncan, S. H. (2013). The influence of diet on the gut microbiota. Pharmacological Research, 69(1), 52–60. http://doi.org/10.1016/j.phrs.2012.10.020

Portune et al. (2017)

Portune, Kevin J., Alfonso Benítez-Páez, Eva Maria Gomez Del Pulgar, Victor Cerrudo, and Yolanda Sanz. "Gut Microbiota, Diet and Obesity-Related Disorders - the Good, the Bad and the Future Challenges." Molecular Nutrition & Food Research, June 2016. doi:10.1002/mnfr.201600252.

Here's another one; see the supplements for details about which foods affect which bacteria.

David, Maurice, et al. (2014)

David, Lawrence A., Corinne F. Maurice, Rachel N. Carmody, David B. Gootenberg, Julie E. Button, Benjamin E. Wolfe, Alisha V. Ling, et al. "Diet Rapidly and Reproducibly Alters the Human Gut Microbiome." Nature 505, no. 7484 (December 11, 2013): 559-63. doi:10.1038/nature12820.

#### 15.0.8 Population studies

The American Gut project citizen science survey of more than 10,000 microbiome samples, published its results in 2018, finding very few clear associations between self-reported *anything* (sex, age, diet) and microbial diversity – except one: people who self-reporting eating the most diverse numbers of plants had higher diversity than those who didn't.

McDonald et al. (2018)

McDonald, D., Hyde, E., Debelius, J. W., Morton, J. T., Gonzalez, A., Ackermann, G., ... Gunder

#### 15.0.9 Enterotypes

The intriguing idea that there may be identifiable patterns in our microbiomes, called enterotypes, was proposed in this highly-cited paper, which includes a detailed methods supplement to show you how to compute it yourself:

Arumugam, Manimozhiyan, Jeroen Raes, Eric Pelletier, Denis Le Paslier, Takuji Yamada, Daniel 80. doi:10.1038/nature09944.

The idea that identifiable enterotypes may exist has been viewed skeptically in follow-up work.

#### 15.0.10 Large population summaries

Twin studies help tease out the different effects of human and microbial DNA. This is a recent update to a study of 1,126 twin pairs:

Goodrich, Julia K., Emily R. Davenport, Michelle Beaumont, Matthew A. Jackson, Rob Knight, C. 43. doi:10.1016/j.chom.2016.04.017.

Two excellent papers present a detailed analysis of the microbiomes and associated phenotypic information from several thousand healthy people in the Belgian Flemish Gut Flora Project (N = 1106) and the Dutch LifeLines-DEEP study (N = 1135).

Falony, G., M. Joossens, S. Vieira-Silva, J. Wang, Y. Darzi, K. Faust, A. Kurilshikov, et al. "Population-Level Analysis of Gut Microbiome Variation." Science 352, no. 6285 (April 29, 2016): 560–64. doi:10.1126/science.aad3503.

Zhernakova, A., A. Kurilshikov, M. J. Bonder, E. F. Tigchelaar, M. Schirmer, T. Vatanen, Z. Mujagic, et al. "Population-Based Metagenomics Analysis Reveals Markers for Gut Microbiome Composition and Diversity." Science 352, no. 6285 (April 29, 2016): 565–69. doi:10.1126/science.aad3369.

Be sure to study the supplemental materials, especially Supplement Table 11, which includes details of the specific microbes.

#### 15.0.11 Methods

A good overview of the current state of how microbiome analysis is performed, from the sample collection processing, to the data pipeline and final bioinformatics summaries. It includes references to the top platforms (e.g QIME, Mothur, PICRUSt) along with the various tradeoffs of each:

Amato, Katherine R. "[An Introduction to Microbiome Analysis for Human Biology Applications]

#### 15.1 Other Resources

Elizabeth Bik keeps an excellent Microbiome Papers Collection of a few dozen classic academic papers.

and you'll find even more in Tyler, Smith, and Silverberg (2014), which is strongly recommended.

#### **15.1.1 Software**

ANCOM (Mandal et al. (2015)) is an open source software tool<sup>1</sup> to help understand abundances.

When we compare populations from one ecosystem (e.g. my results on Monday) with another (e.g. my results on Tuesday), there is a fundamental statistical sense in which the two populations are not comparable.

This paper gives the analogy of trying to compare two forests after capturing 100 animals in each: you count 20 bears in one and 30 in the other. There are statistical ways to say with confidence that the first forest is composed of 20% bears and the other 30%, but there is no way to conclude that the second forest has more bears without knowing the total number of animals in each.

A reliance on relative abundances (i.e. percentages) carries other, statistical, problems. For example, the Pearson correlation coefficient is difficult to interpret, since the sum-to-one characteristic of relative abundances requires mathematically that there be some negative correlations. If the numbers were absolute, you wouldn't necessarily have negative correlations.

<sup>&</sup>lt;sup>1</sup>The R code is here: http://www.niehs.nih.gov/research/resources/software/biostatistics/ancom/index.cfm

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