



Hologenomics

applied to host-microbiota interactions
in marine organisms

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CENTER FOR
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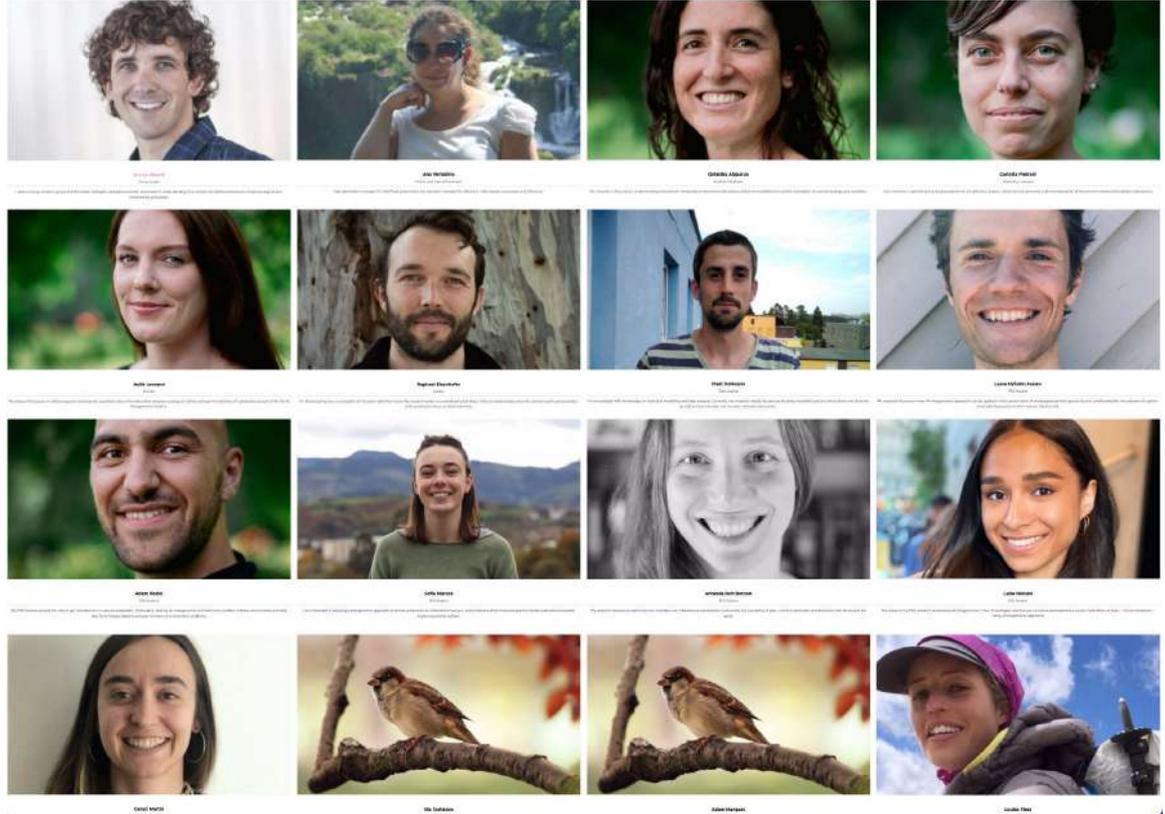
#EAStalk
 "Fish and gut microbiota dialogue. Towards standard methods and genetics, nutrition and host transcriptomic interactions"

 Ariadna Sitja-Bobadilla, Jaume Pérez-Sánchez, Maria Carla Piazzon, Simona Filimoli

  2:35



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Hologenomics



55' 14.30 - 15.25	Session 1 Animal-microbiota interactions
50' 15.30 - 16.20	Session 2 Drivers of animal-microbiota interaction variation
75' 16.30 - 17.45	Session 3 Hologenomics to study animal-microbiota interactions
30' 18.00 - 18.30	Session 4 Applications of hologenomics: opportunities and feasibility

Questions Many Questions

Hologenomics



Silence
Long
Silence

Hologenomics



Session 1

Animal-microbiota

INTERACTIONS

Hologenomics



FishMed-PhD



WHAT IS AN ANIMAL FOR A MICROORGANISM?

Habitat
Shelter
Source of nutrients

...

WHAT IS A MICROBE FOR AN ANIMAL?

Source of nutrients
Pathogen
Stimulus

...

Session 1

Animal-microbiota

INTERACTIONS

HOW DO ANIMALS AND MICROORGANISMS INTERACT?

Evolutionary interactions

Ecological interactions

Molecular interactions

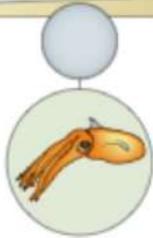
Hologenomics

a

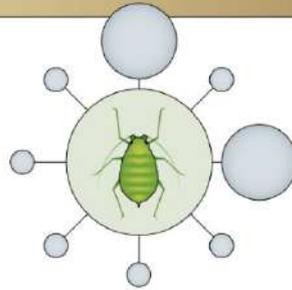
Increasing complexity gradient in animal-associated microbiotas



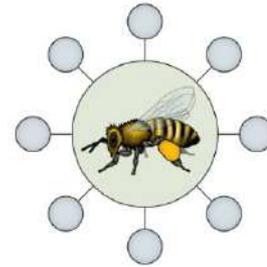
Lepidoptera caterpillar gut
No detectable
resident microbiota



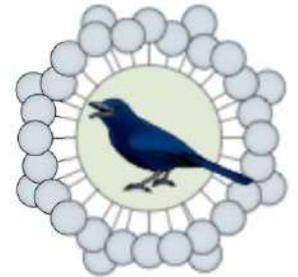
Bobtail squid light organ
Single symbiont



Aphid bacteriocytes
1–2 primary symbionts +
a few microorganisms



Honey bee gut
A few microorganisms



Vertebrate gut
Hundreds of
microorganisms

Hologenomics

RESOLUTION



FishMed-PhD

Photo: Todd Bretl





FishMed-PhD

Hologenomics

RESOLUTION

Light
organ



Gut

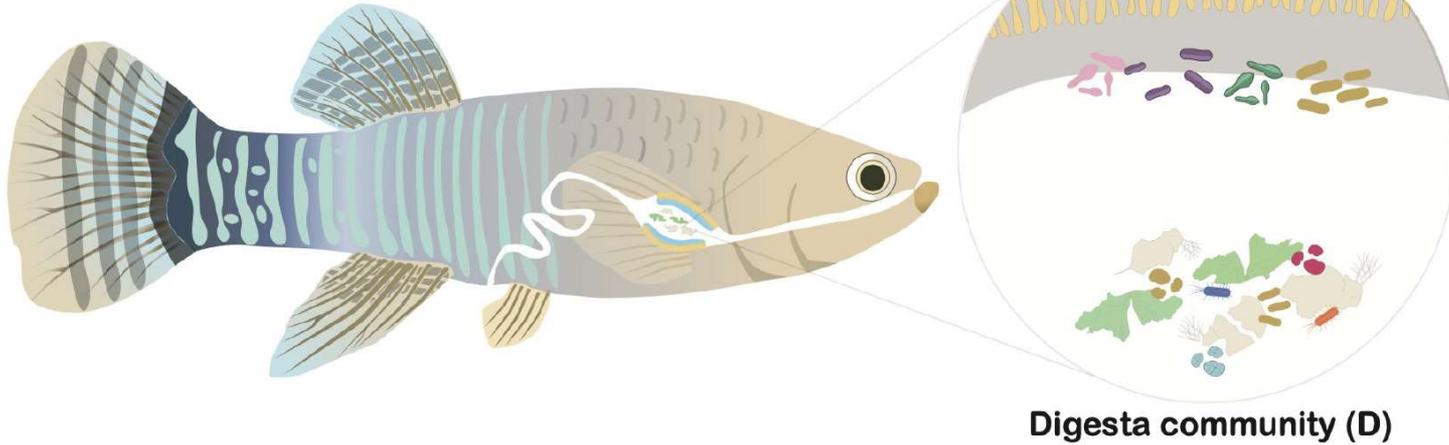


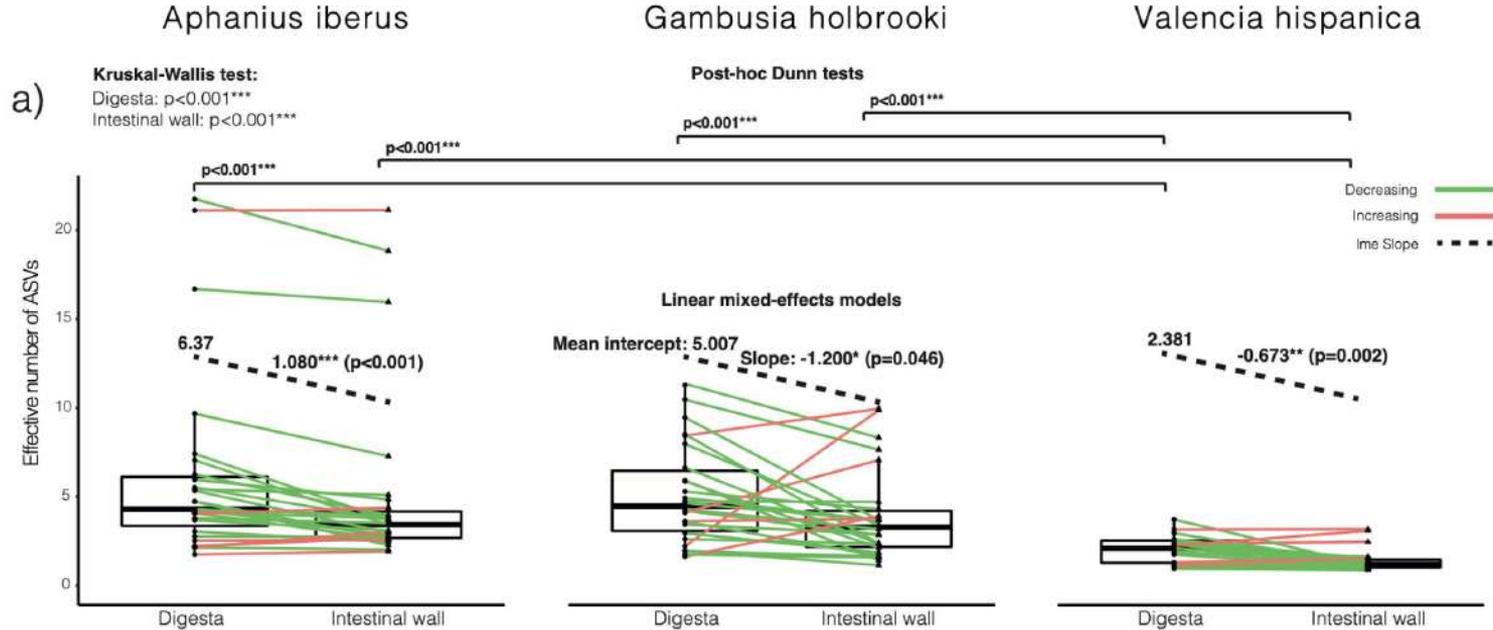
Photo: Todd Bretl



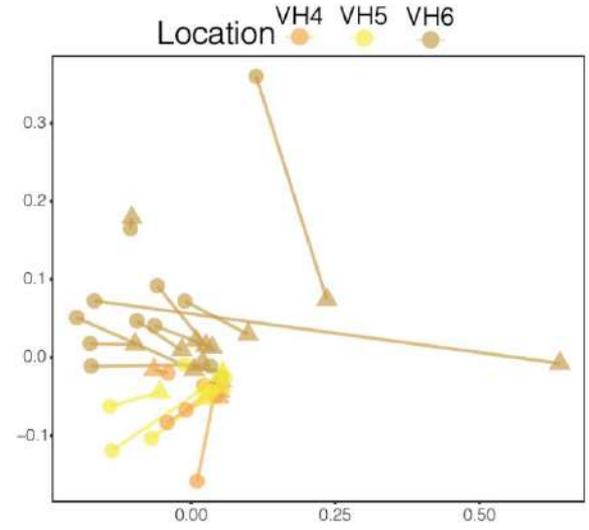
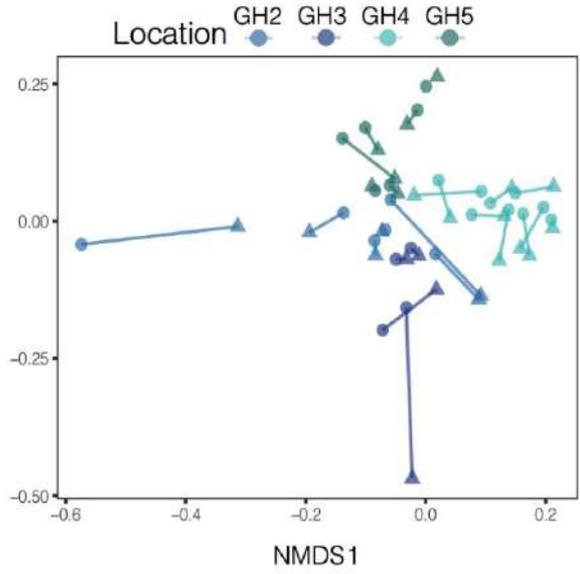
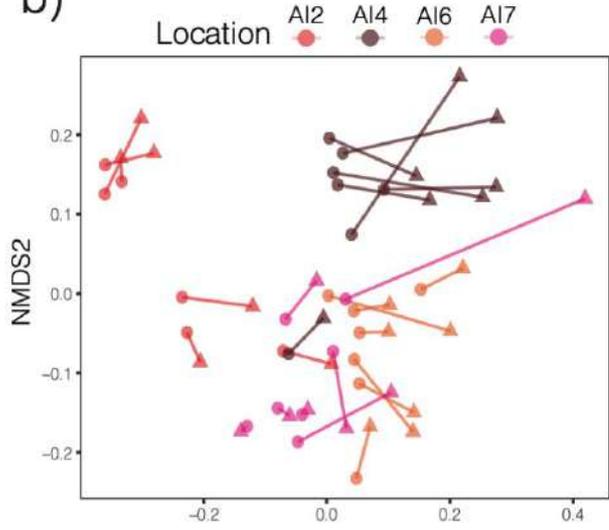
Hologenomics

RESOLUTION





b)



WHAT DOES IT MEAN TO BE ASSOCIATED WITH A HOST?

Group discussion

WHAT DOES IT MEAN TO BE ASSOCIATED WITH A HOST?

**Is every microbe we detect in the skin
or the intestine of animals
“associated” with it?**

Occur?

Occur for a long time?

Occur in multiple individuals?

Proliferate?

Influence the host?

INTERESTING READINGS

HOW DO ANIMALS AND MICROORGANISMS INTERACT? MOLECULAR LEVEL

Hologenomics

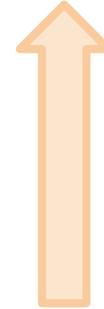
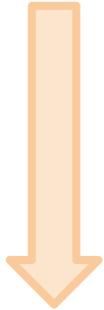


Microbes



Response

AMP, IgA...



MAMPs

LPS, SCFA...

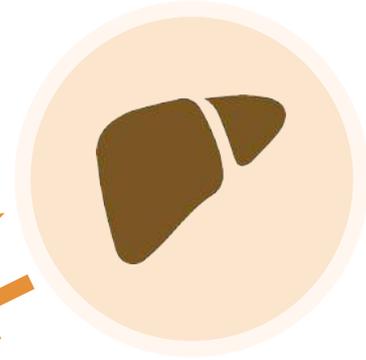
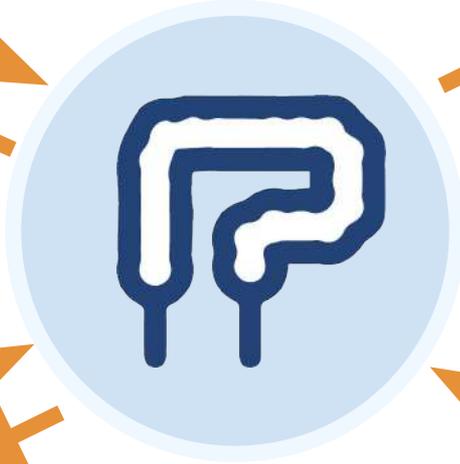
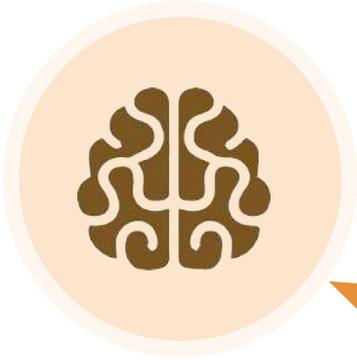


Receptors

TLR, NLR, GPCR...

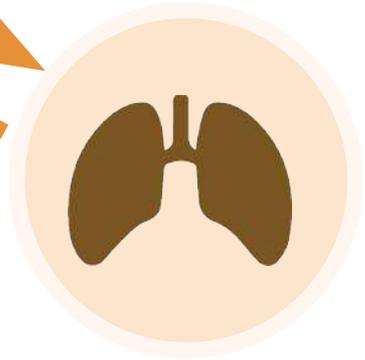
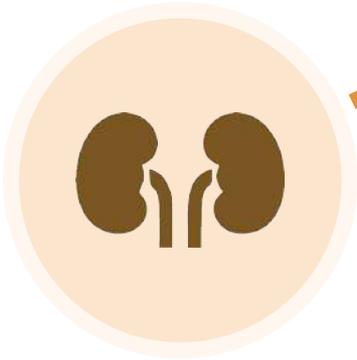
Hologenomics

**Gut-
brain
axis**



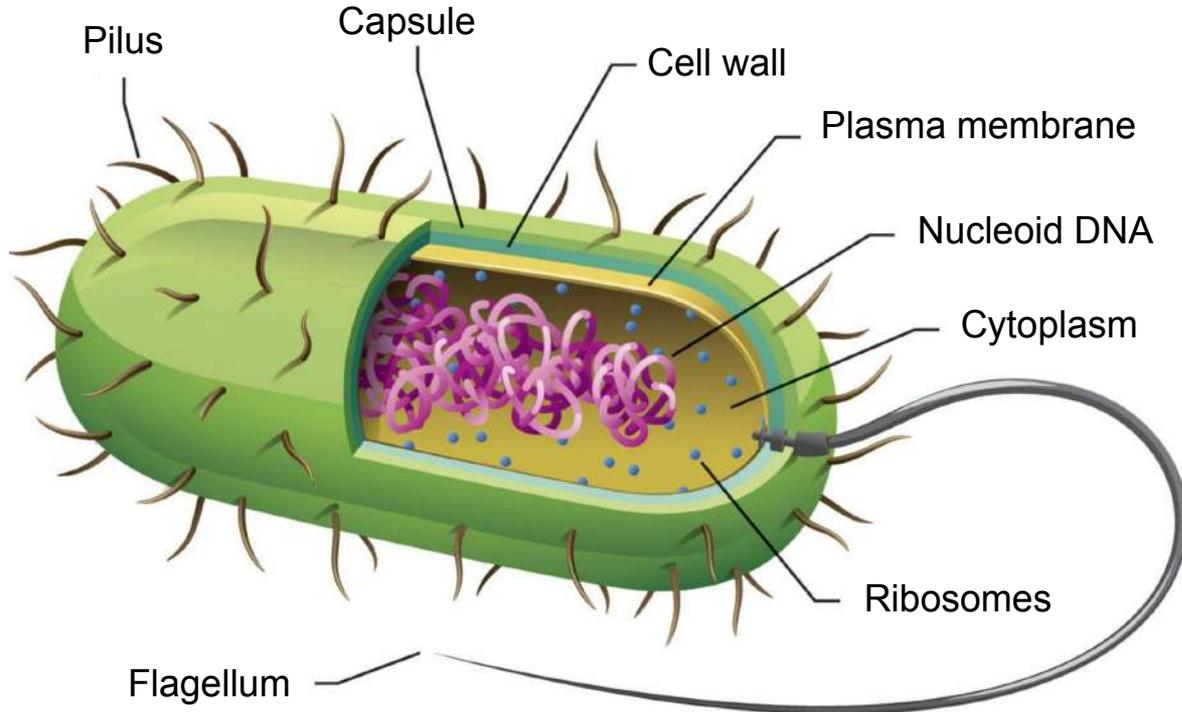
**Gut-
liver
axis**

**Gut-
kidney
axis**

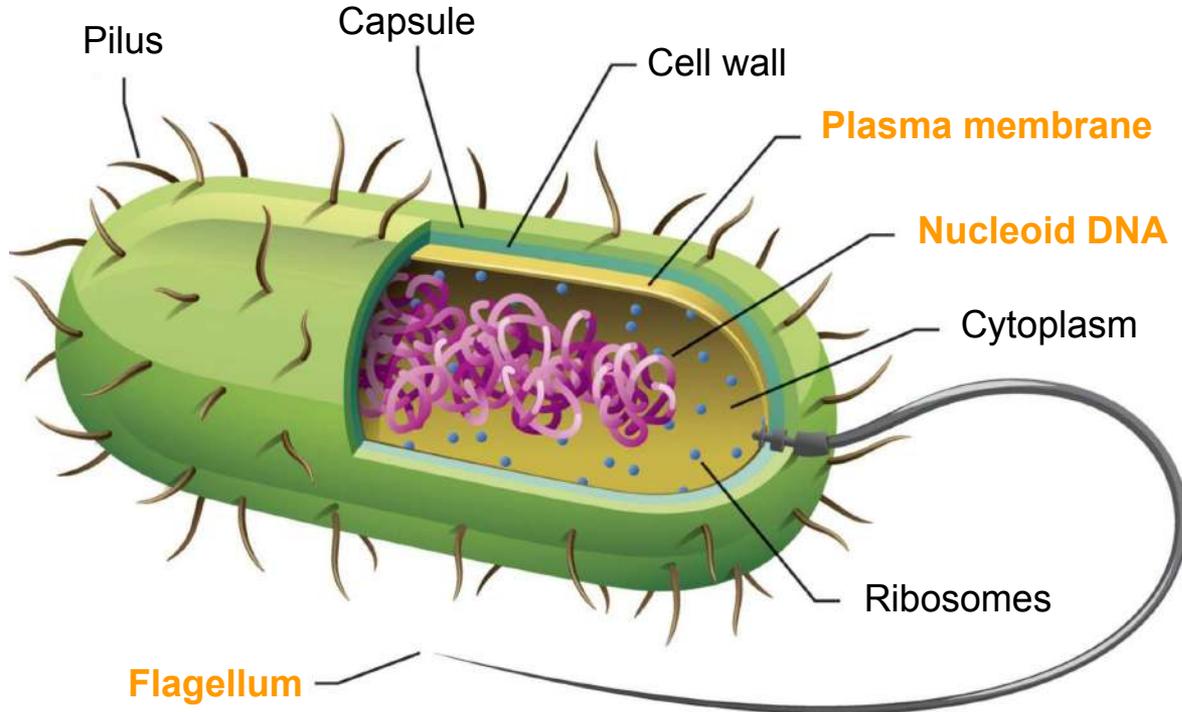


**Gut-
lung
axis**

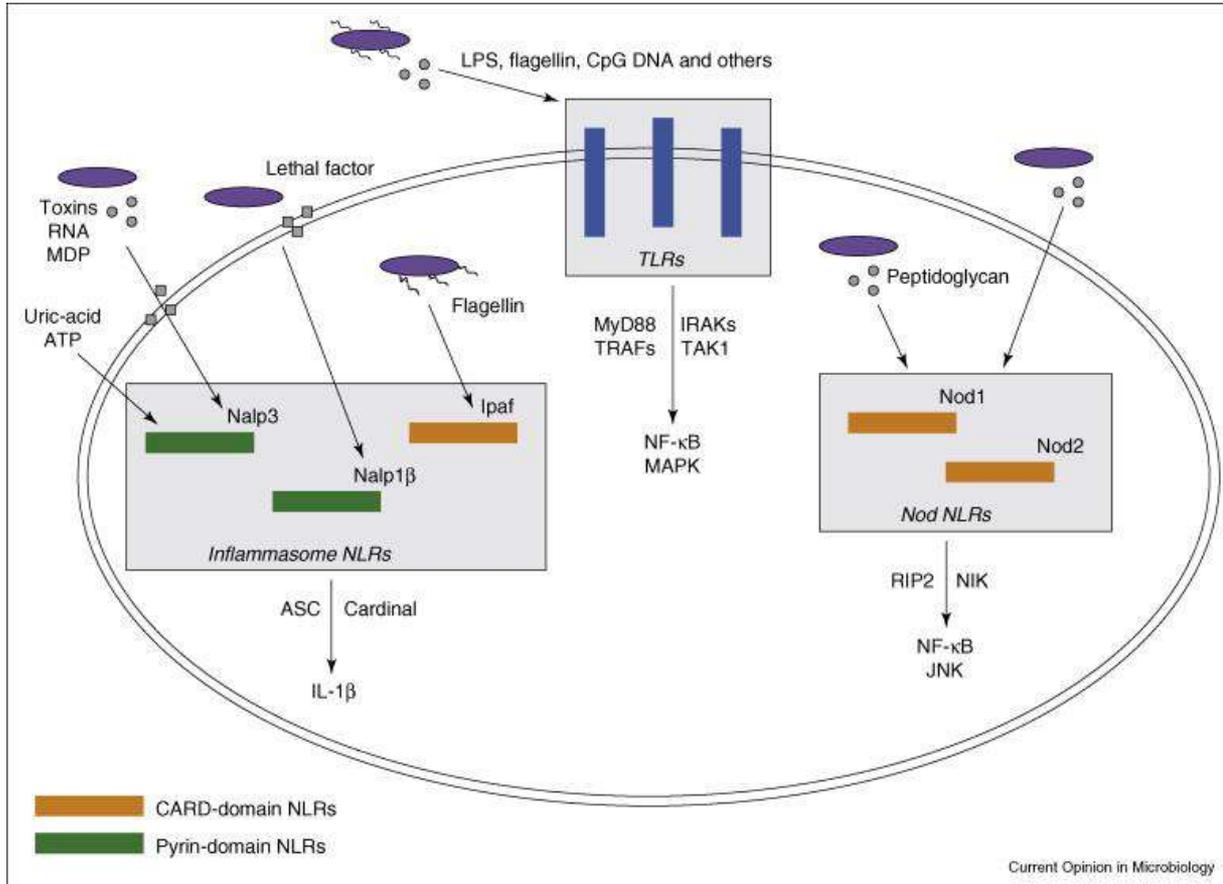
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Hologenomics



- **Lipopolysaccharides (LPS)**
- **Di- and triacylated lipopeptides**
- **Lipoteichoic acids (LTA)**
- **Flagellin**
- **CpG DNA**
- **Peptidoglycan**
- **Polysaccharide A (PSA)**



Toll-like receptors (TLR)

Nod-like Receptors (NLR)

Kufer et al. 2007

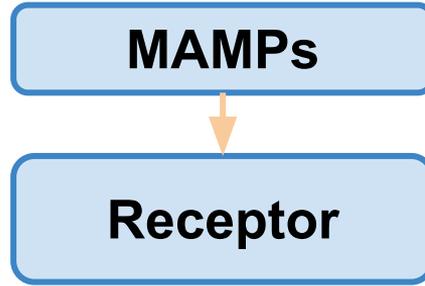
Current Opinion in Microbiology

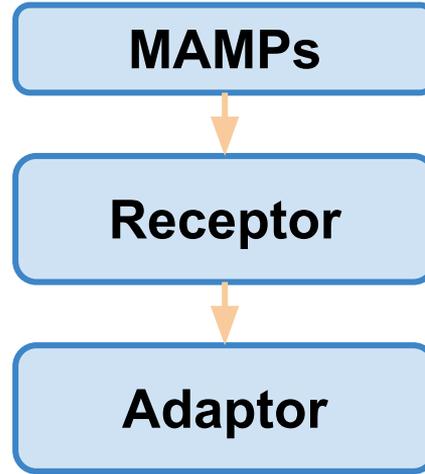
Hologenomics

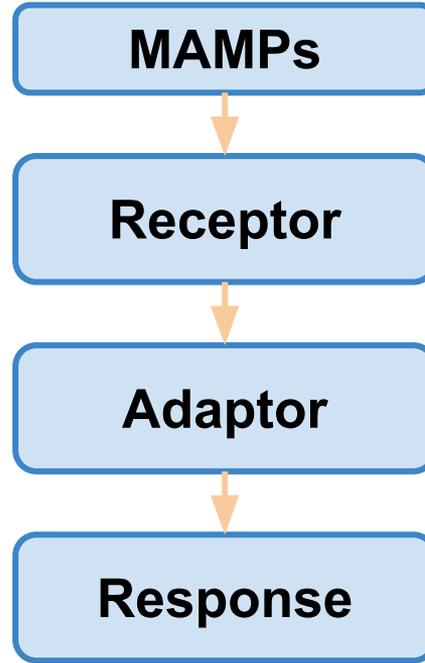
MAMPs



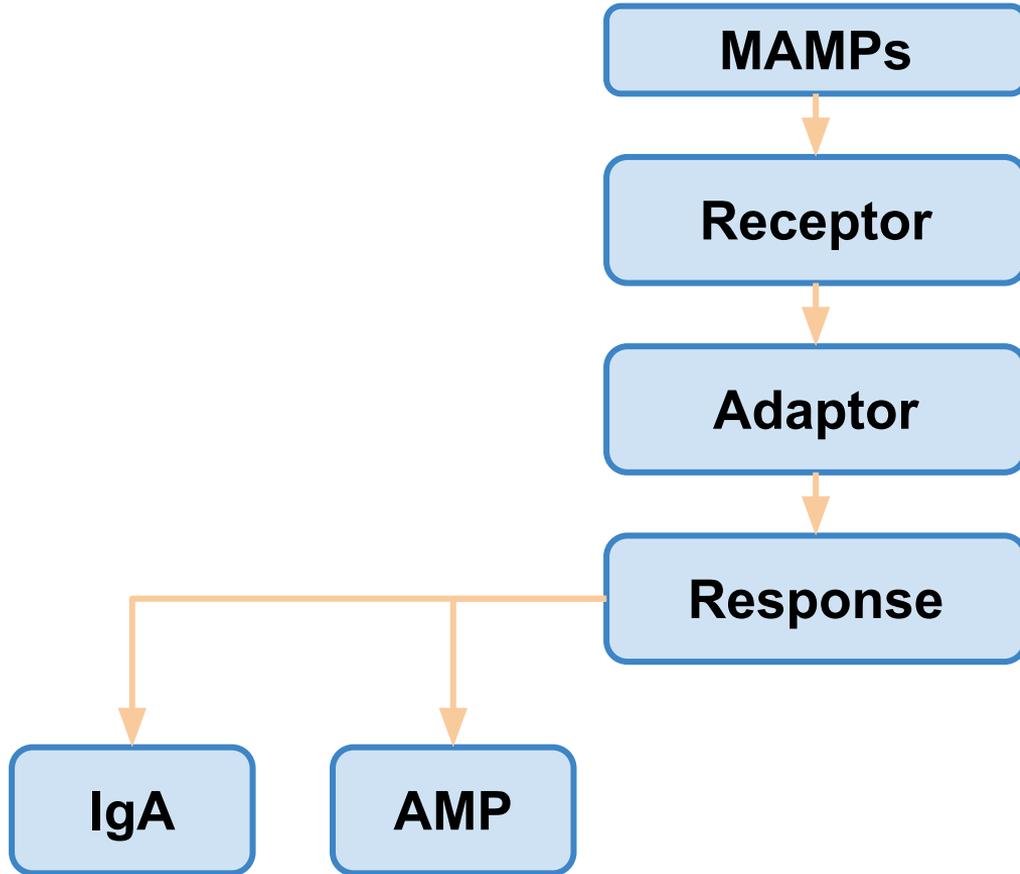
Hologenomics

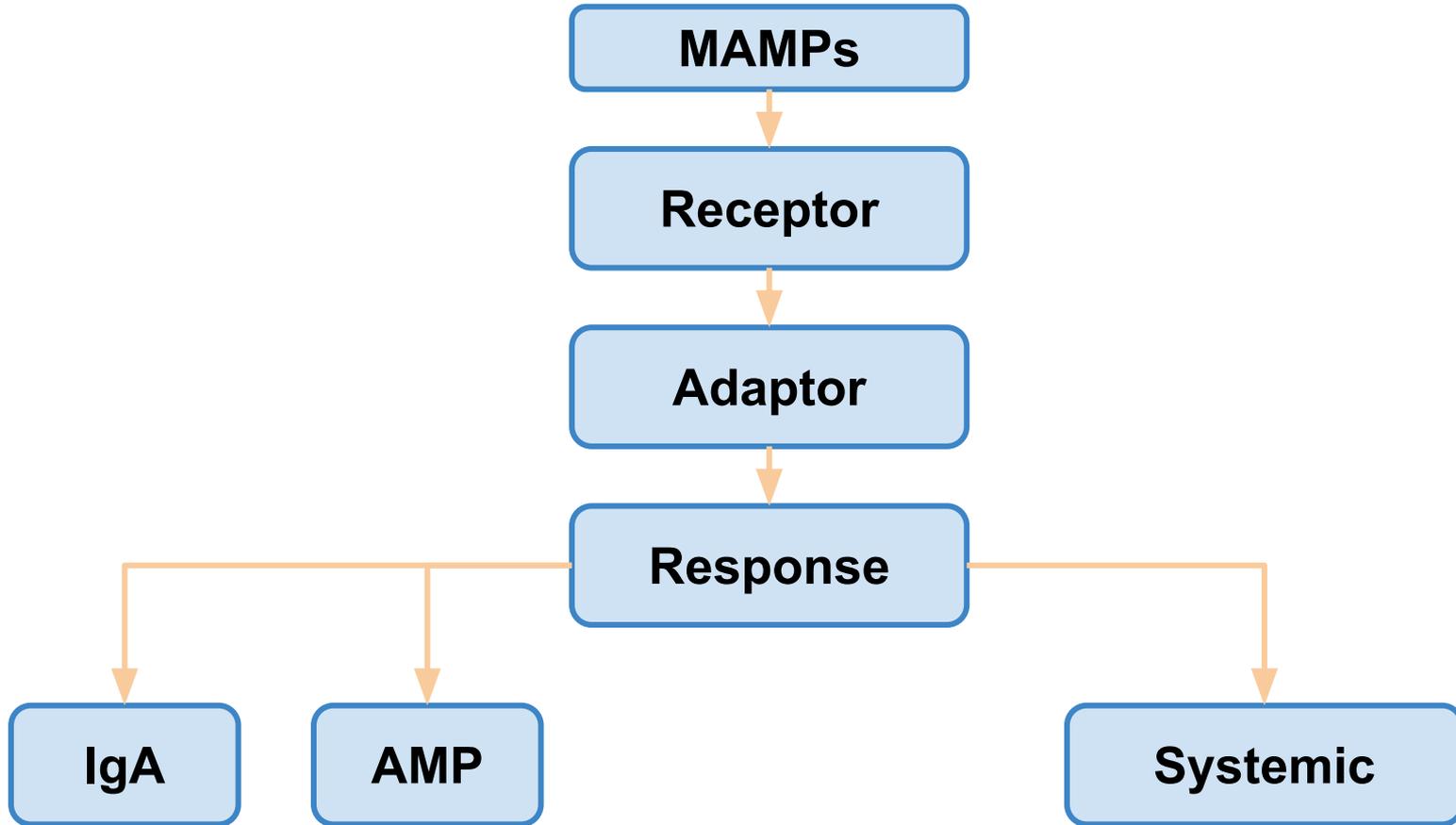






Hologenomics





Hologenomics

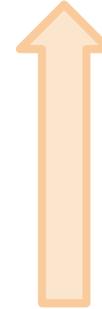


Microbes



Response

AMP, IgA...



MAMPs

LPS, SCFA...



Receptors

TLR, NLR, GPCR...

INTERESTING READINGS

HOW SELECTIVE IS THE HOST RESPONSE?

**What are the implications of being
more or less selective?**

HOW DO ANIMALS AND MICROORGANISMS INTERACT? EVOLUTIONARY LEVEL

CAN HOSTS AND BACTERIA CO-EVOLVE?

**CAN HOSTS AND BACTERIA
CO-EVOLVE?**

**CAN HOSTS AND MICROBIOMES
CO-EVOLVE?**

INTERESTING READINGS



Hologenomics

applied to host-microbiota interactions
in marine organisms

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Session 2

DRIVERS AND DYNAMICS of animal-microbiota interactions

WHAT FACTORS DRIVE ANIMAL-MICROBIOTA INTERACTIONS?

Hologenomics

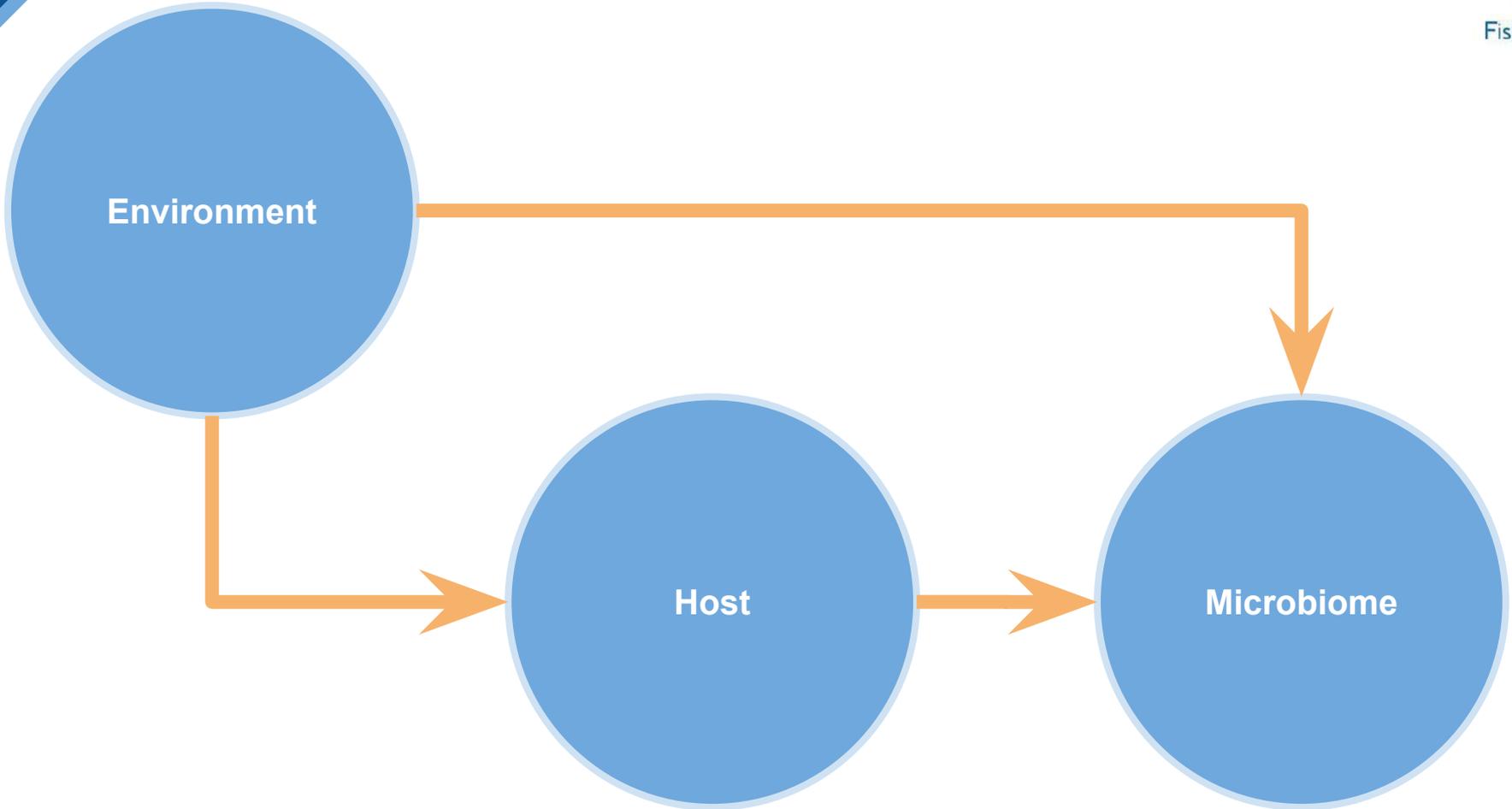


Environment

Microbial
genetics

Host genetics

Hologenomics



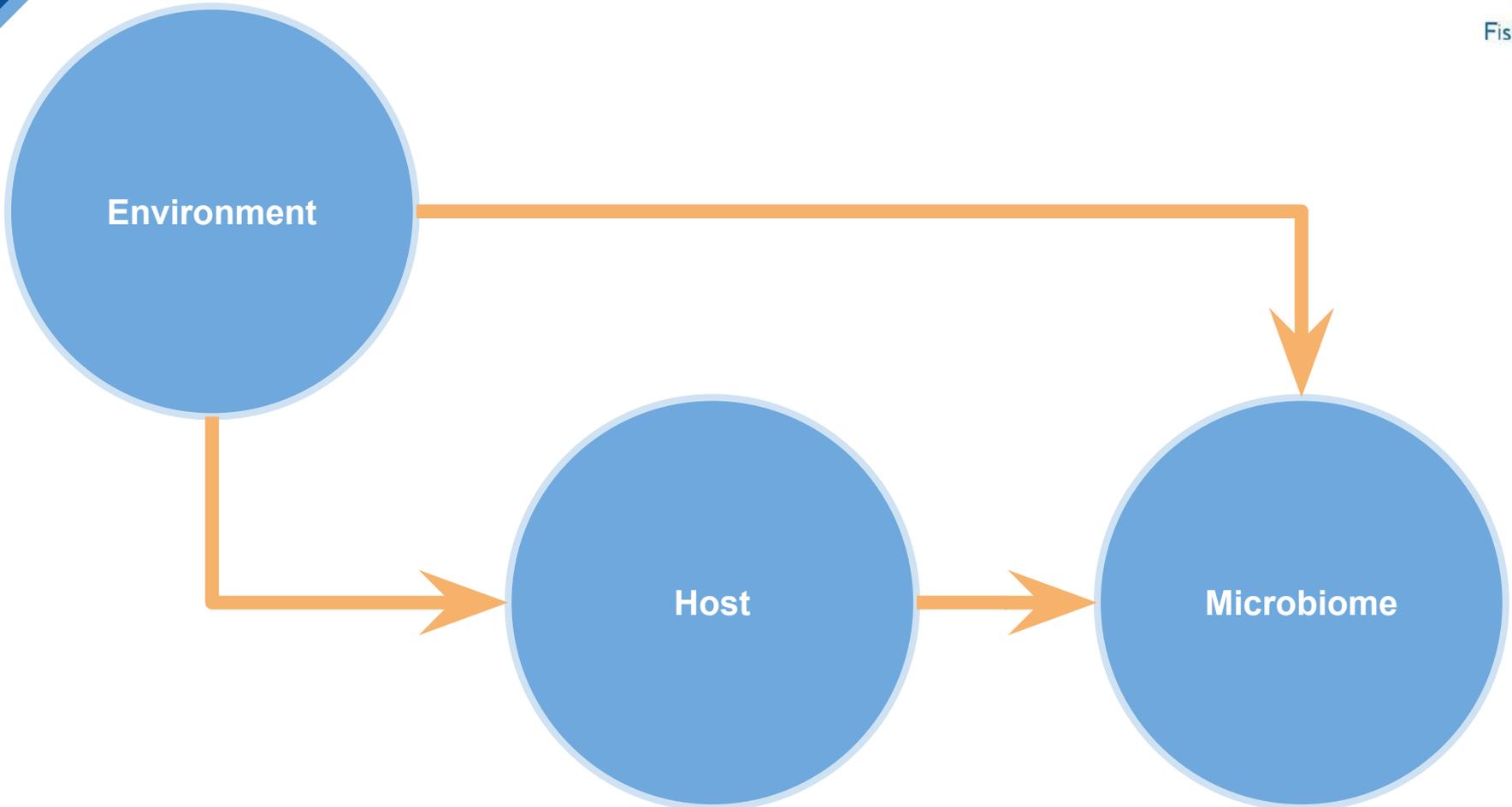
WHAT IS AN ENVIRONMENTAL FACTOR?

**Any factor not encoded in
the genetic material of
microbes and hosts**

WHICH ENVIRONMENTAL FACTORS DO AFFECT ANIMAL-MICROBIOTA INTERACTIONS?

Diet
Temperature
Humidity
Physiological state
of the host

Hologenomics



INTERESTING READINGS

METAGENOMIC SPACE

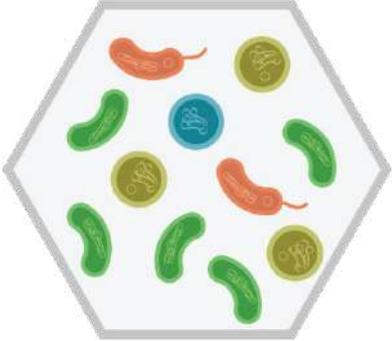
Hologenomics



FishMed-PhD

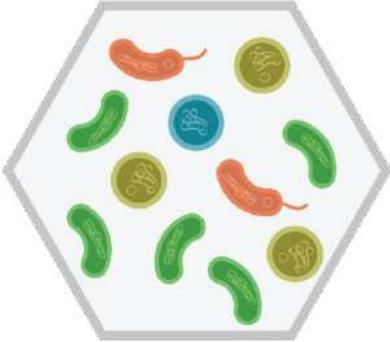


A

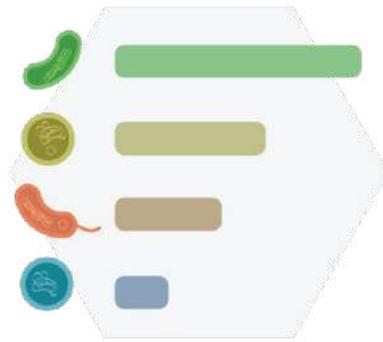


METAGENOMIC STATE

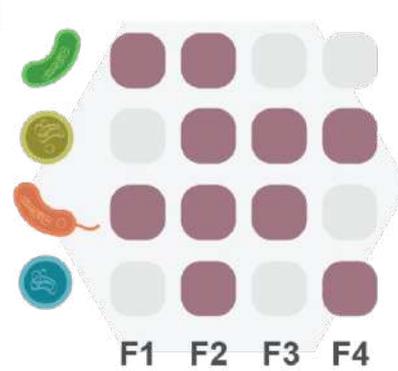
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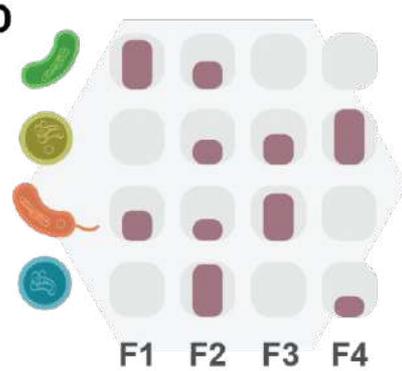
B



C

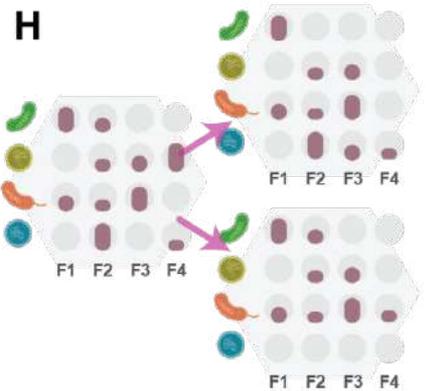
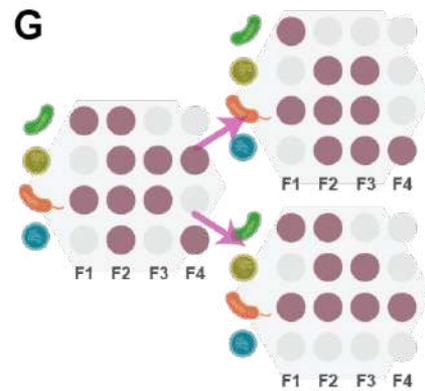
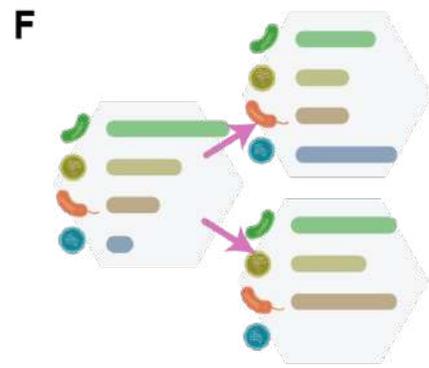
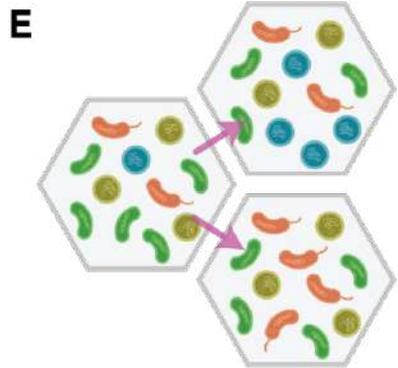
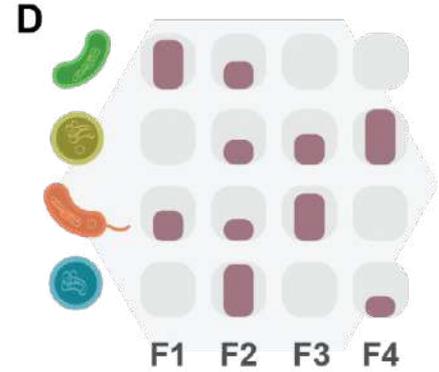
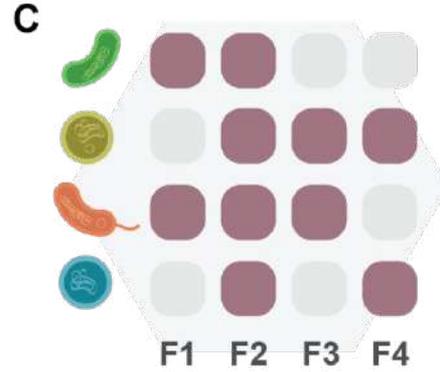
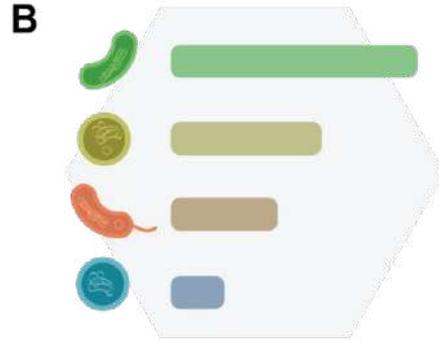
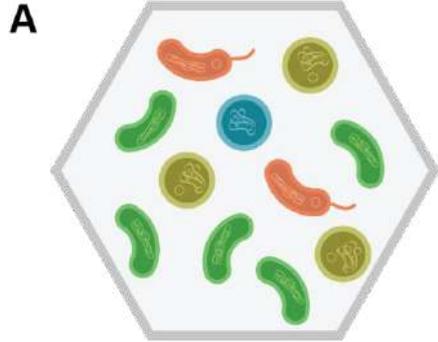


D



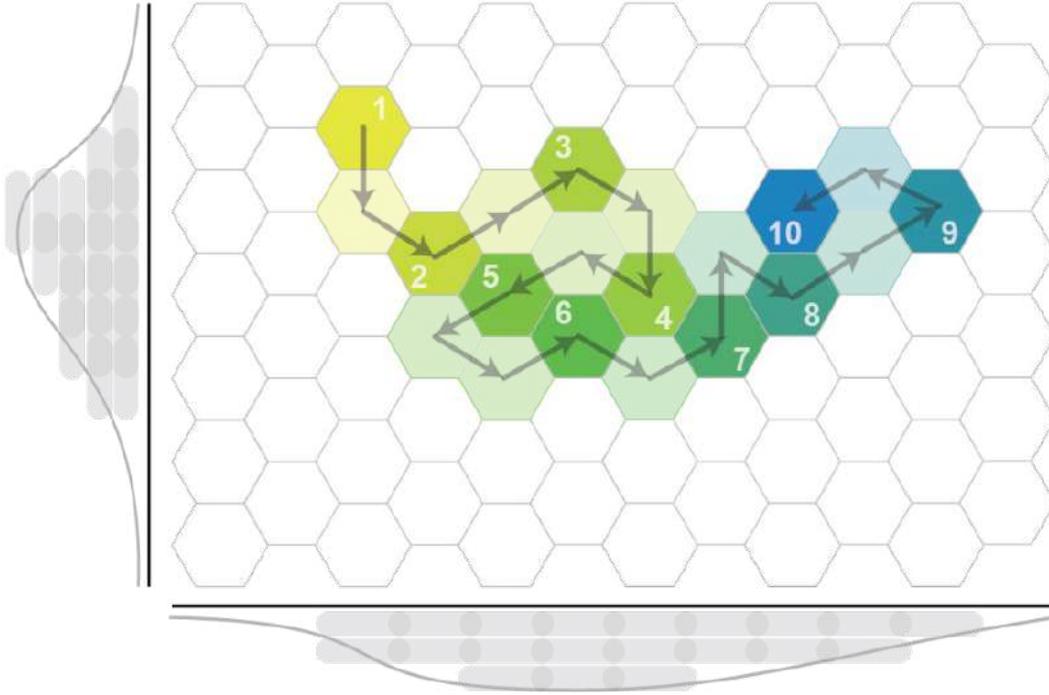
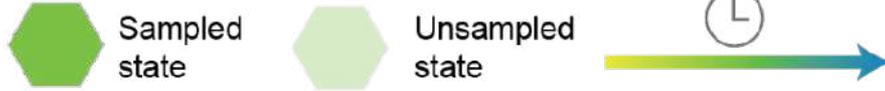
METAGENOMIC STATE

Hologenomics



Hologenomics

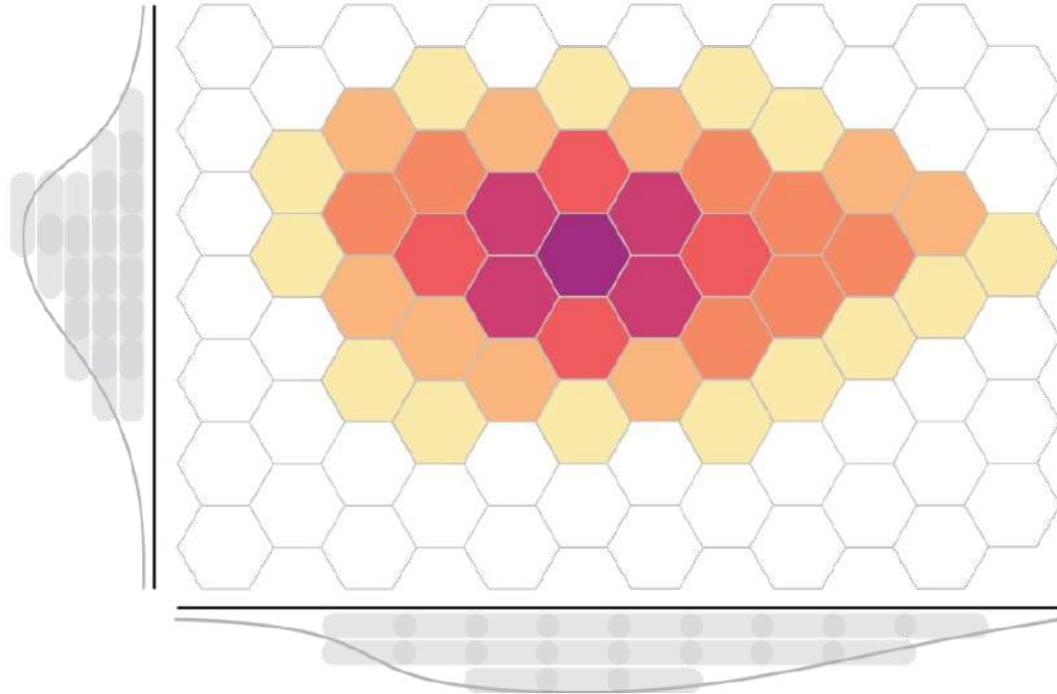
A



METAGENOMIC SPACE

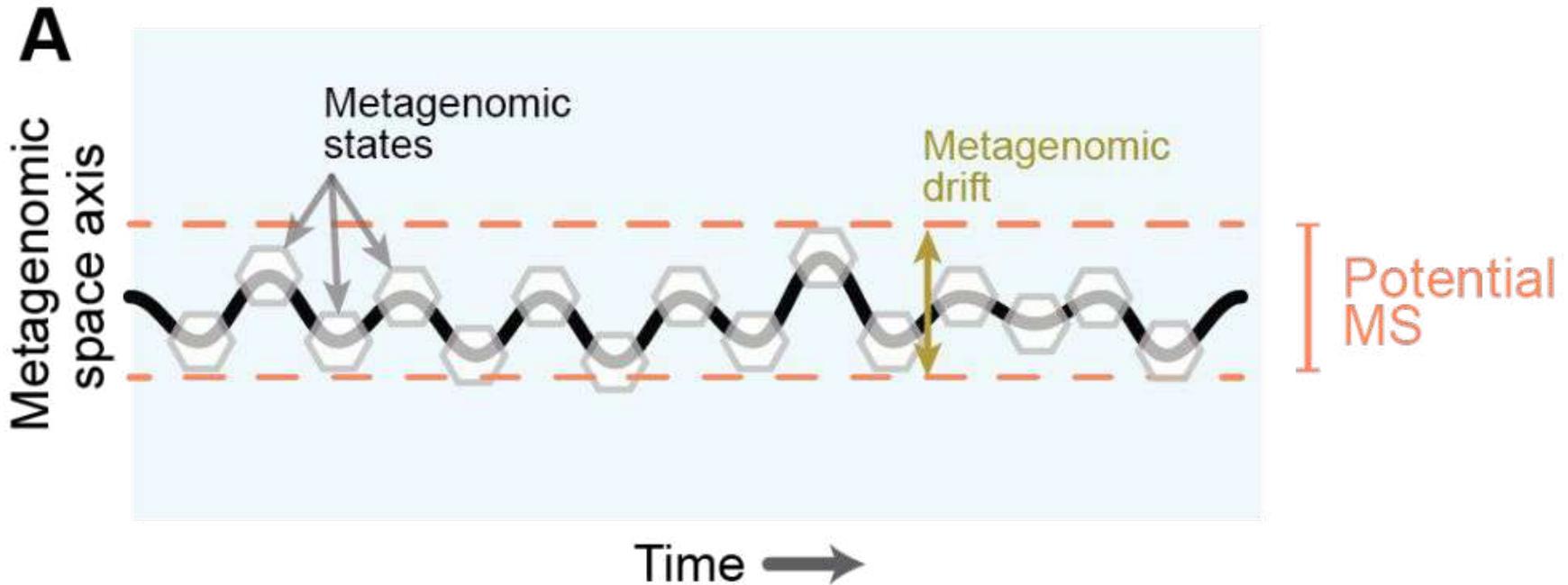
B

Low probability  High probability

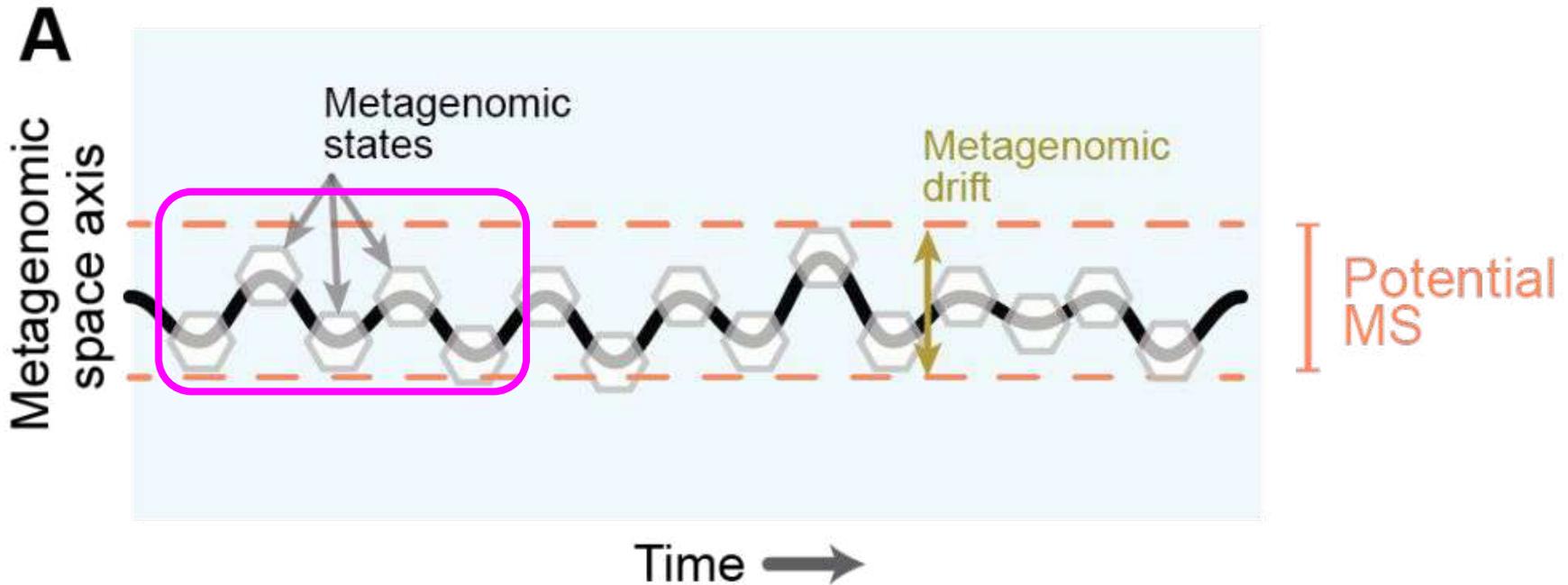


**METAGENOMIC
SPACE
MODEL**

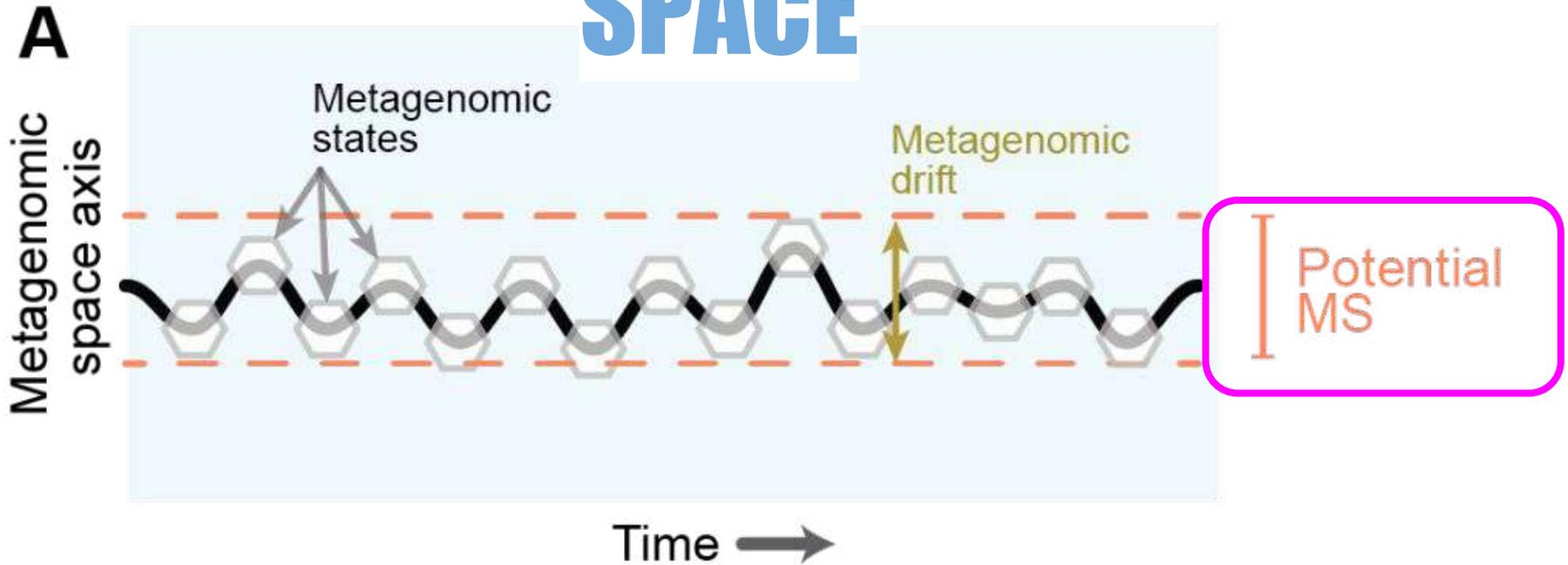
METAGENOMIC STATE DYNAMICS

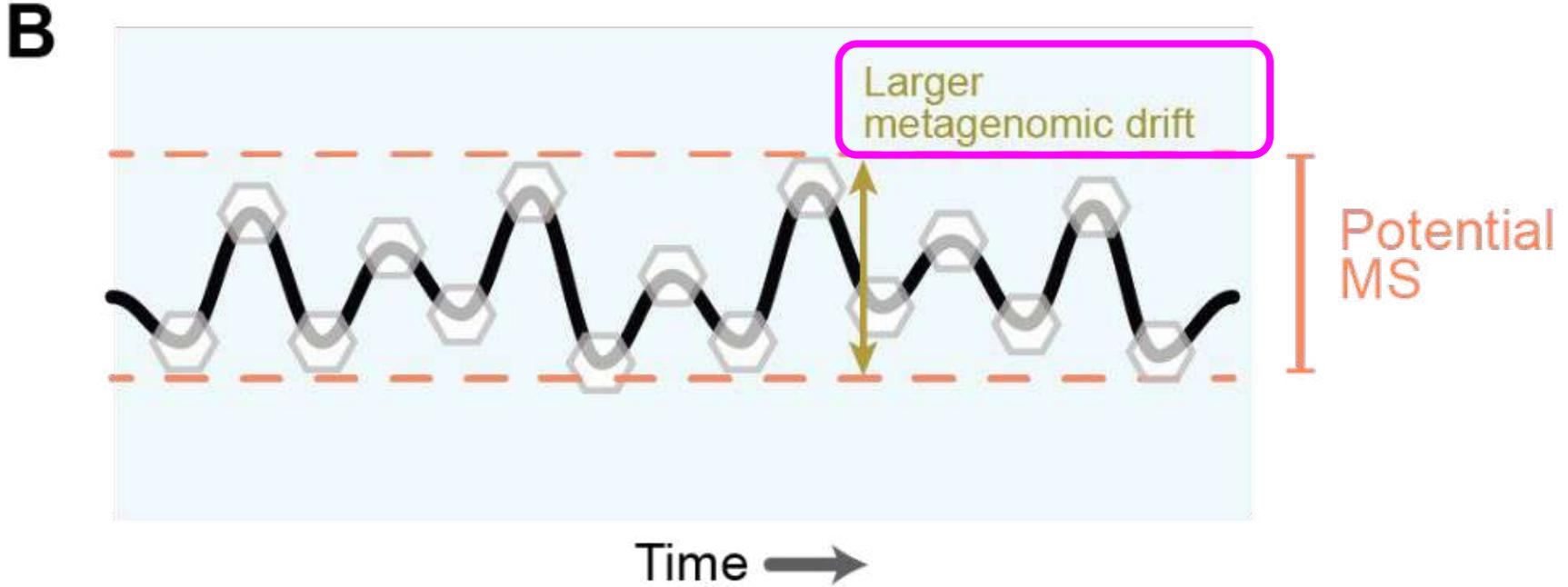


METAGENOMIC STATE DYNAMICS

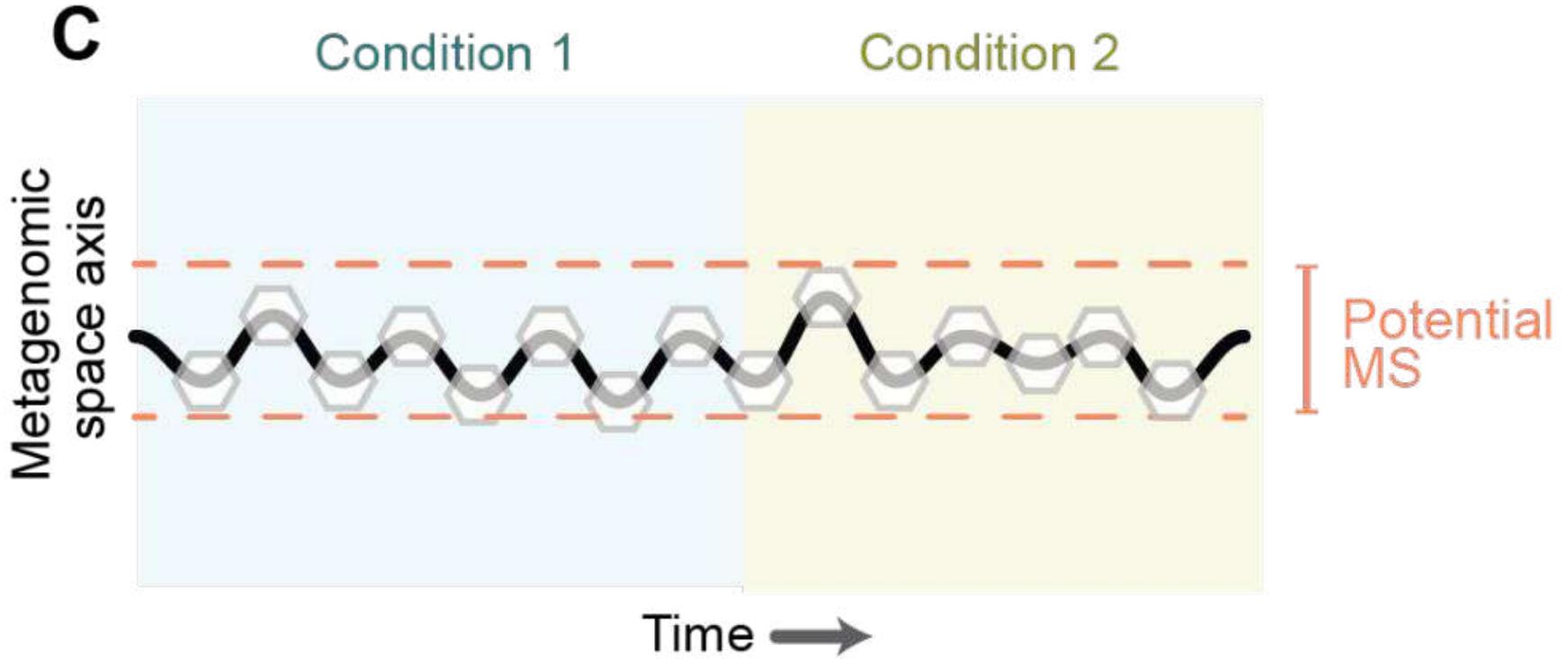


POTENTIAL METAGENOMIC SPACE

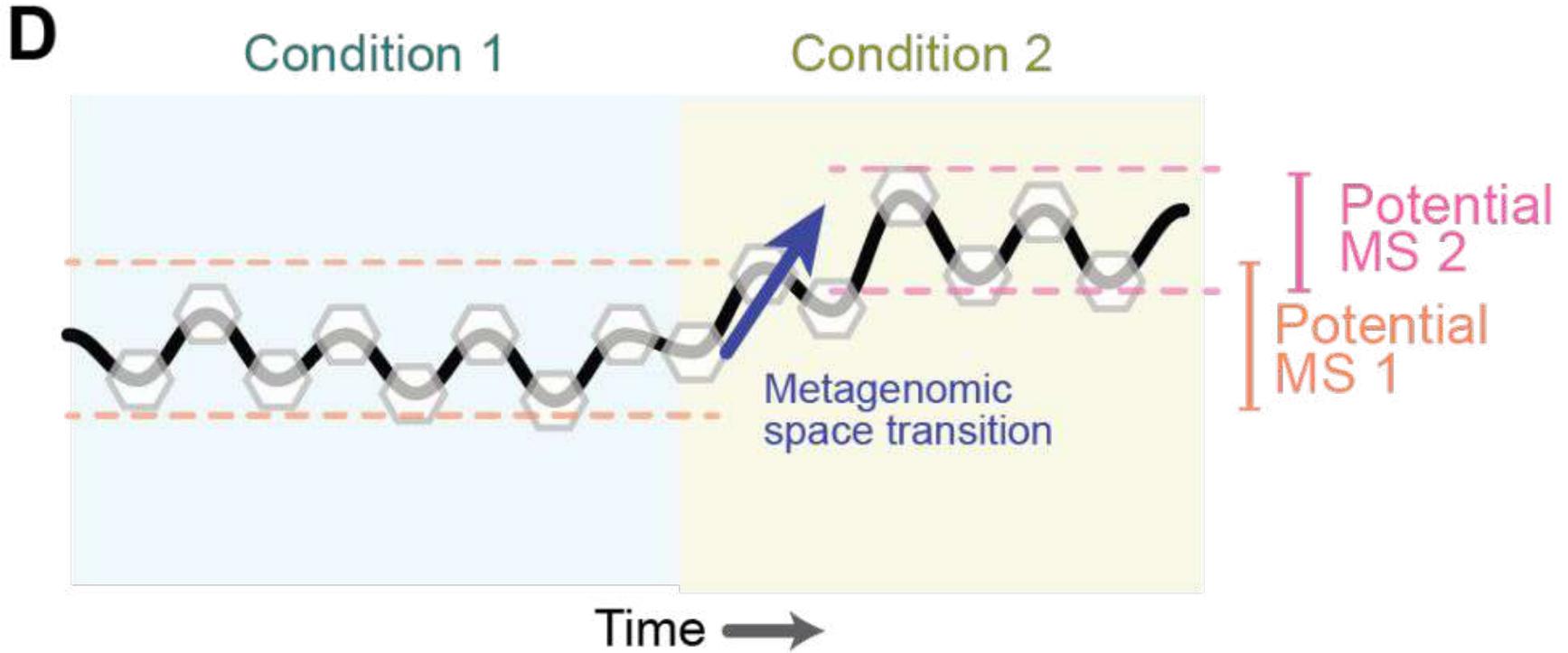


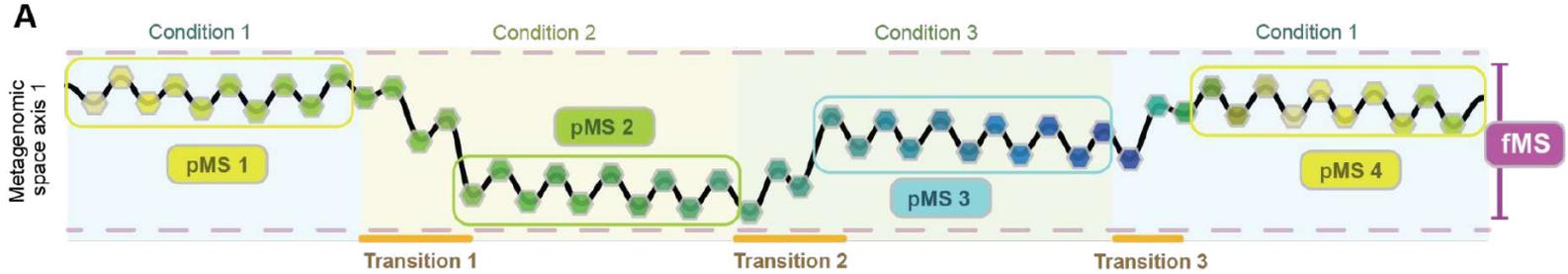


Hologenomics



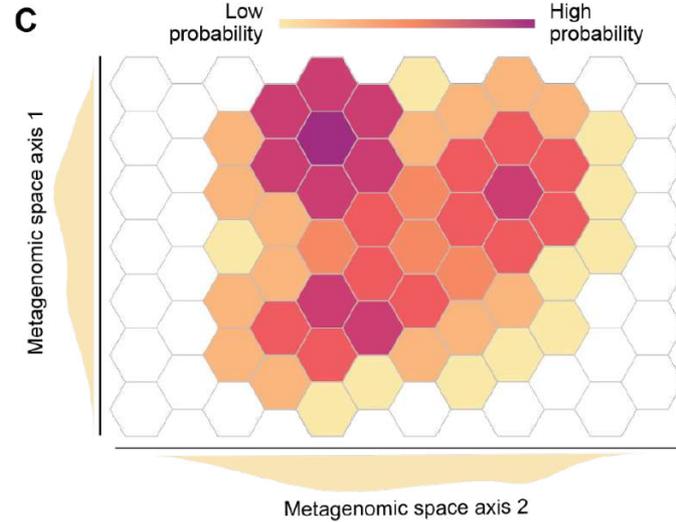
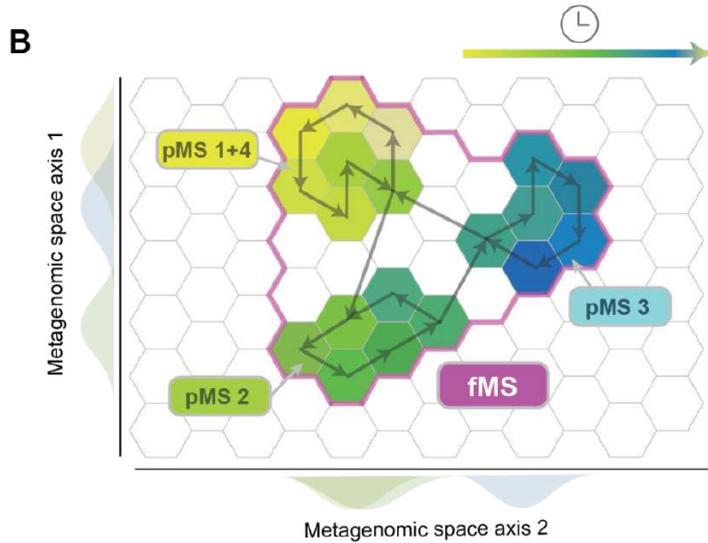
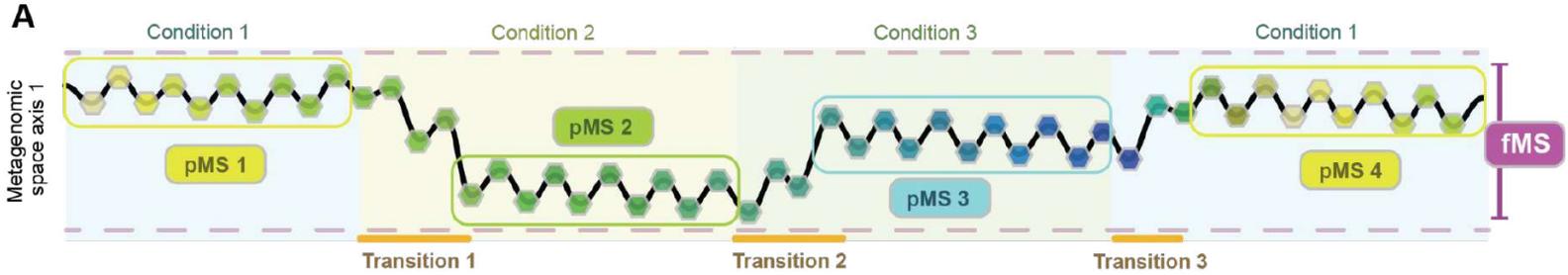
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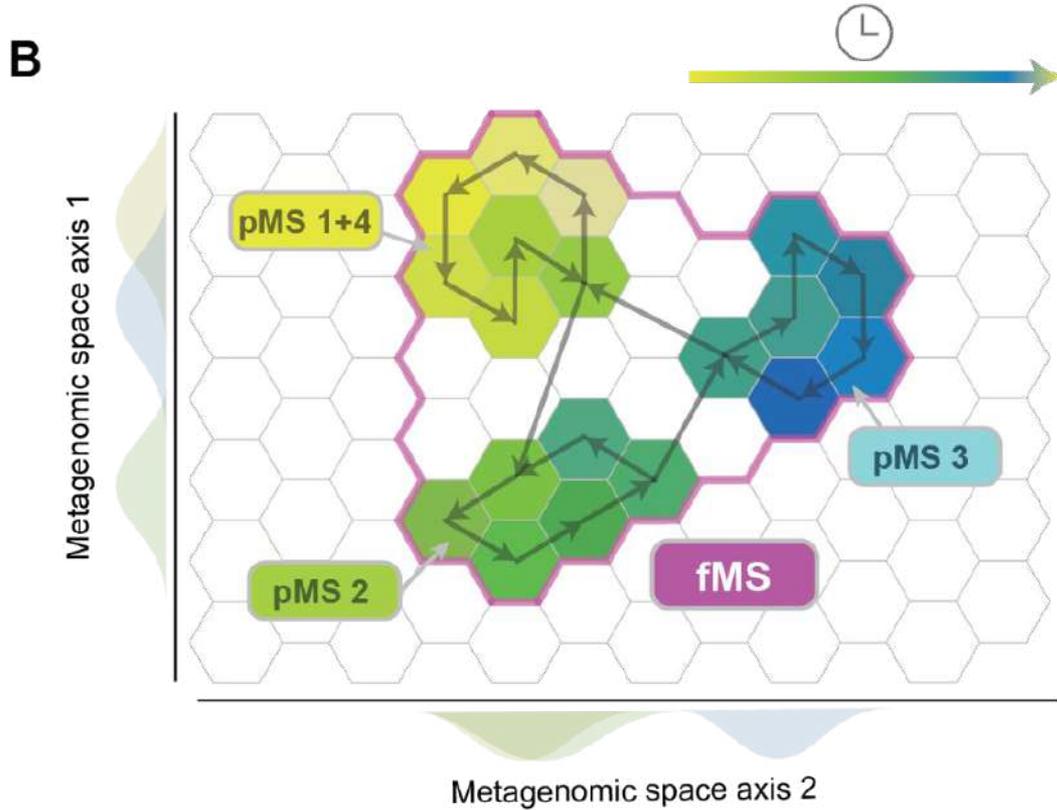


FUNDAMENTAL METAGENOMIC SPACE

Hologenomics



WHAT FACTORS DO DETERMINE POTENTIAL AND FUNDAMENTAL METAGENOMIC SPACES?



HOW CAN METAGENOMIC SPACES BE ESTIMATED?

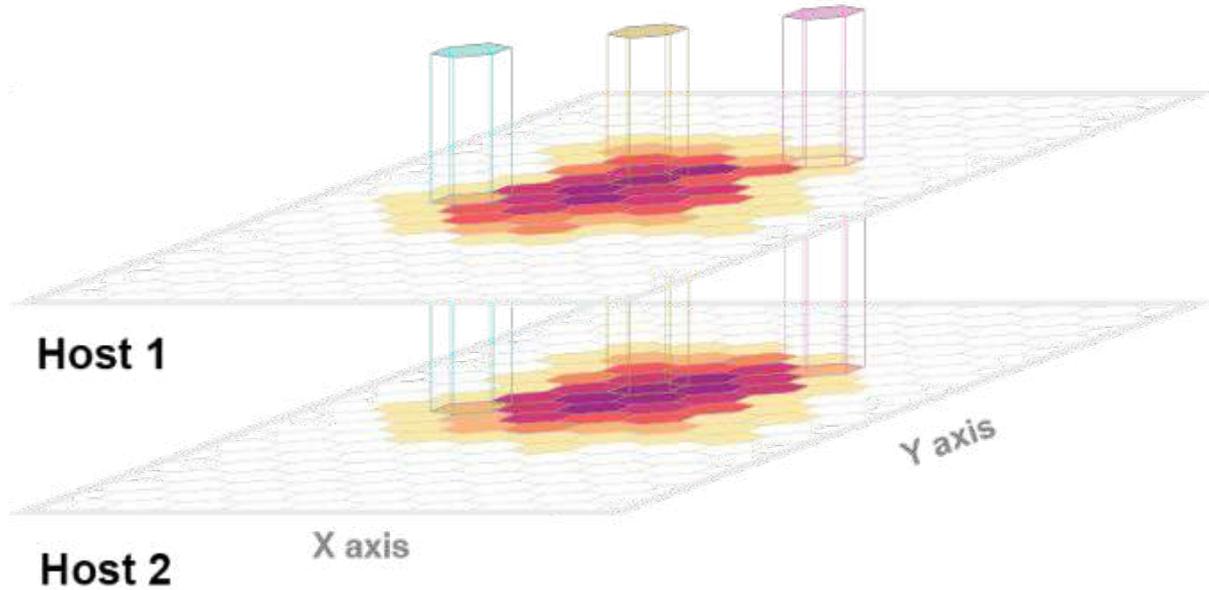
Hologenomics



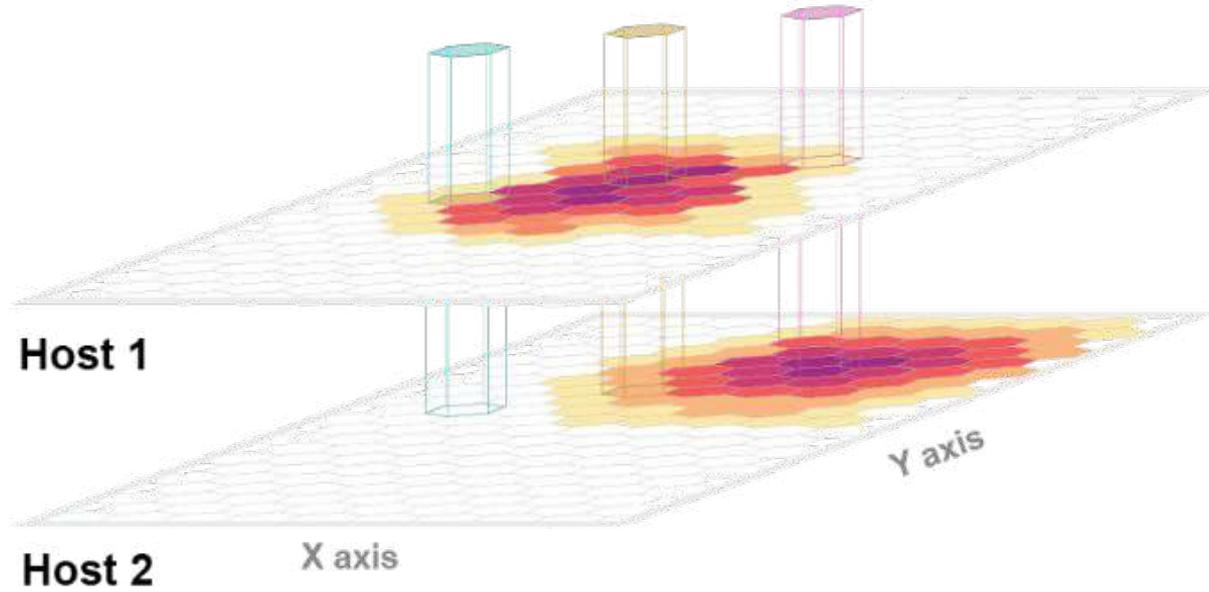
FishMed-PhD

WHAT ARE THE IMPLICATIONS OF METAGENOMIC SPACES?

Hologenomics



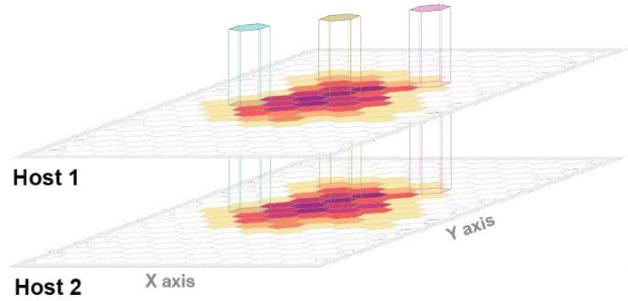
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Hologenomics

A

Monozygotic twins



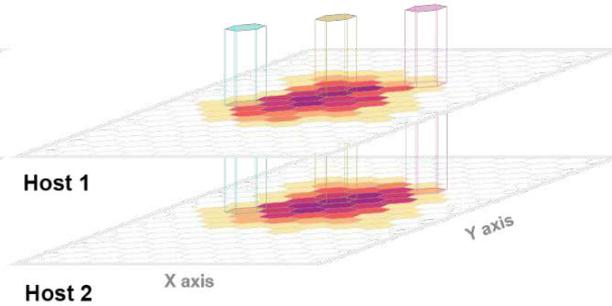
Metagenomic state 1 Host 1  =  Host 2

Metagenomic state 2 Host 1  =  Host 2

Metagenomic state 3 Host 1  =  Host 2

B

Dizygotic twins



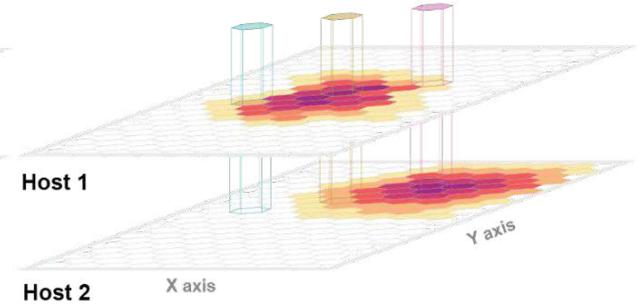
Metagenomic state 1 Host 1  =  Host 2

Metagenomic state 2 Host 1  =  Host 2

Metagenomic state 3 Host 1  <  Host 2

C

Different ethnicities



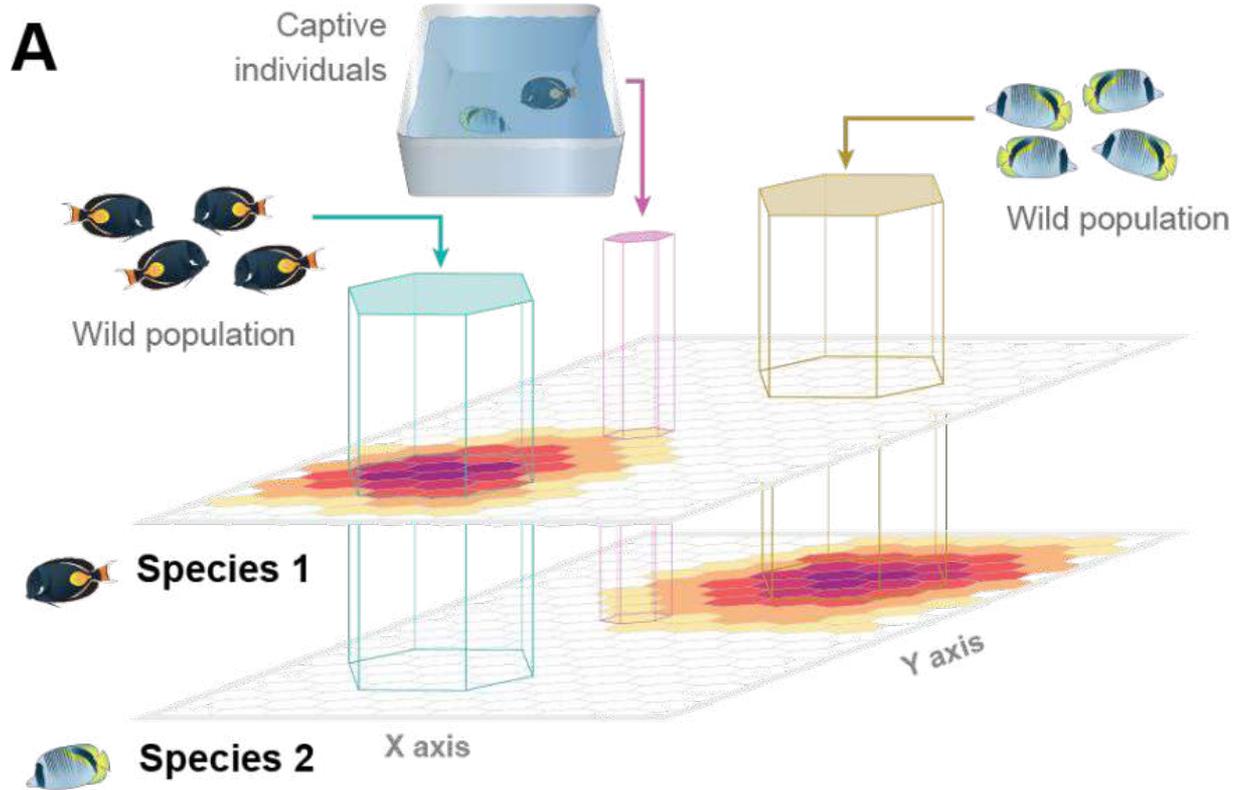
Metagenomic state 1 Host 1  = ~~~~ Host 2

Metagenomic state 2 Host 1  >  Host 2

Metagenomic state 3 Host 1  <  Host 2

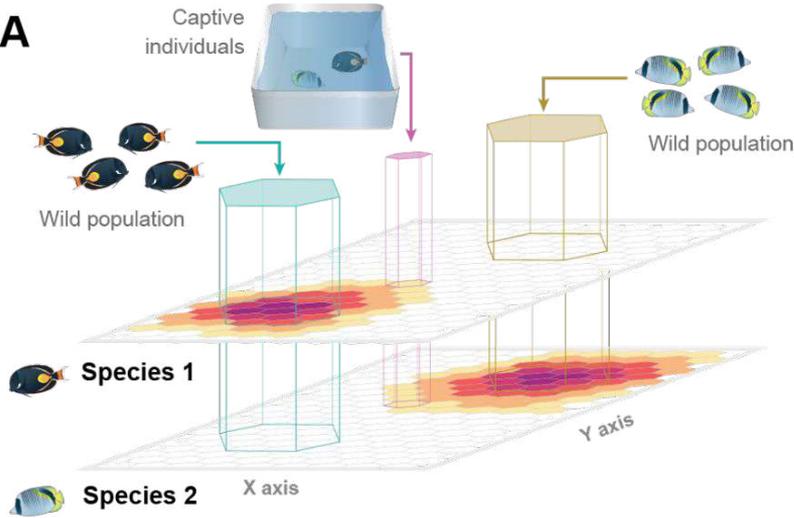
Metagenomic state probability Low  High

Hologenomics

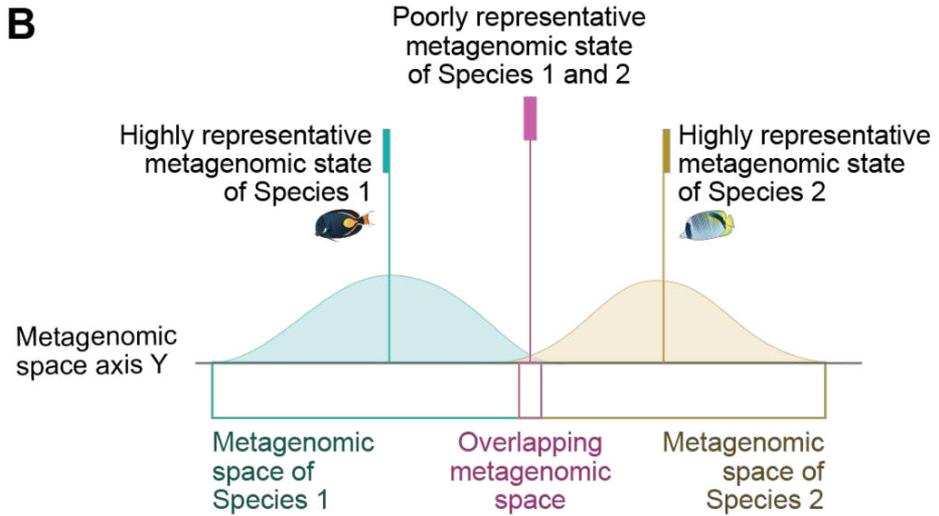


Hologenomics

A

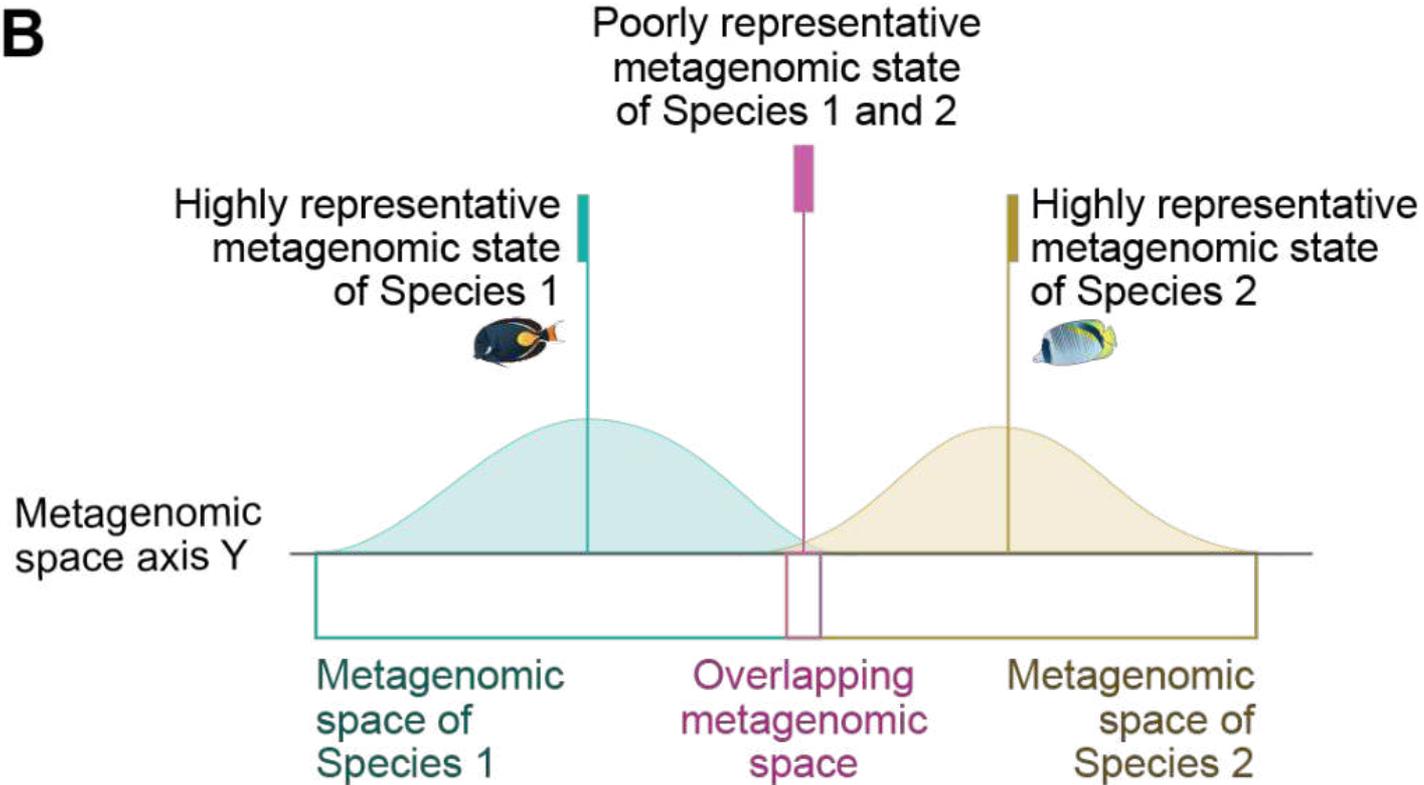


B



Hologenomics

B





Hologenomics

applied to host-microbiota interactions
in marine organisms

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Session 3

HOLOGENOMICS to study animal-microbiota interactions

**How would you
define
hologenomics?**

Hologenomics

The integrated study of the genetic features of a eukaryotic host alongside that of its associated microbes

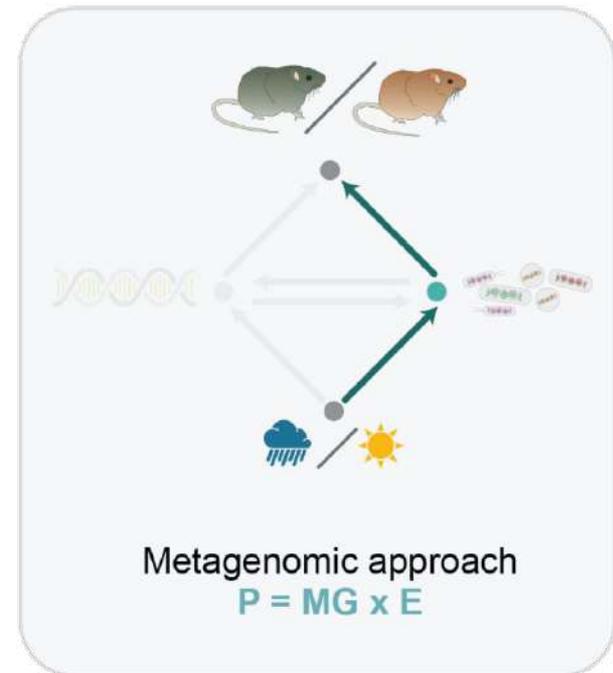
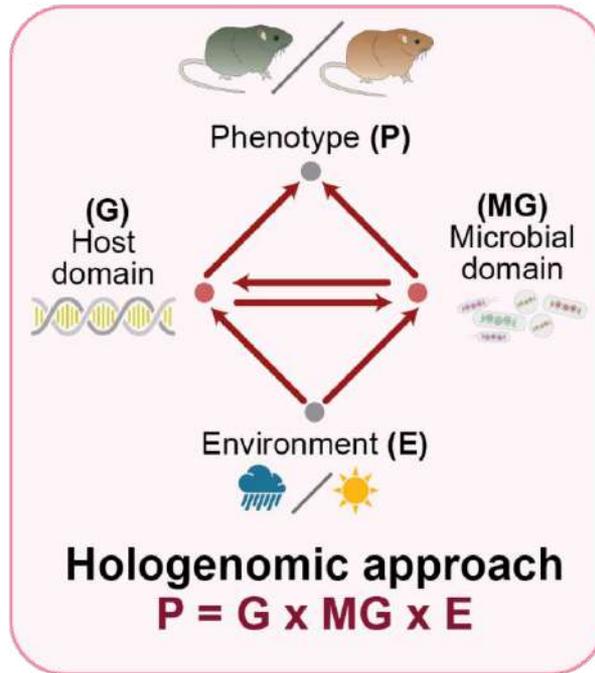
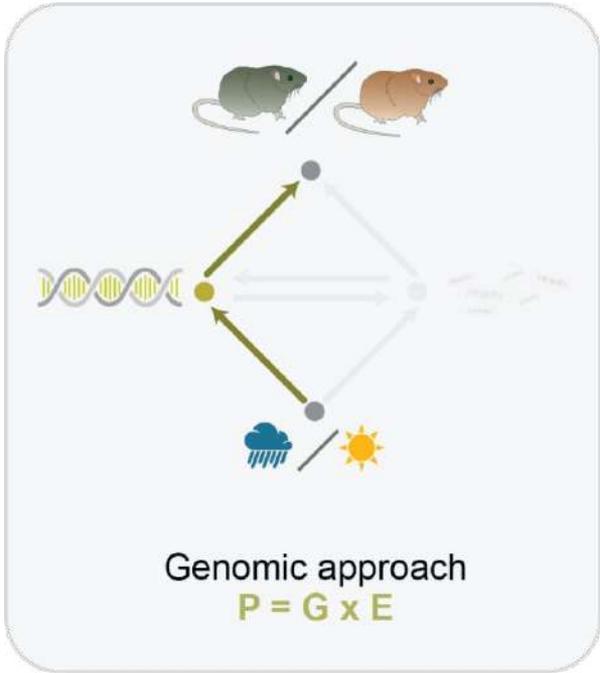
Hologenome

The entirety of the genetic information contained by a eukaryotic host and the microbial community associated with that host.

Hologenomics



FishMed-PhD



$$P = G \times E$$

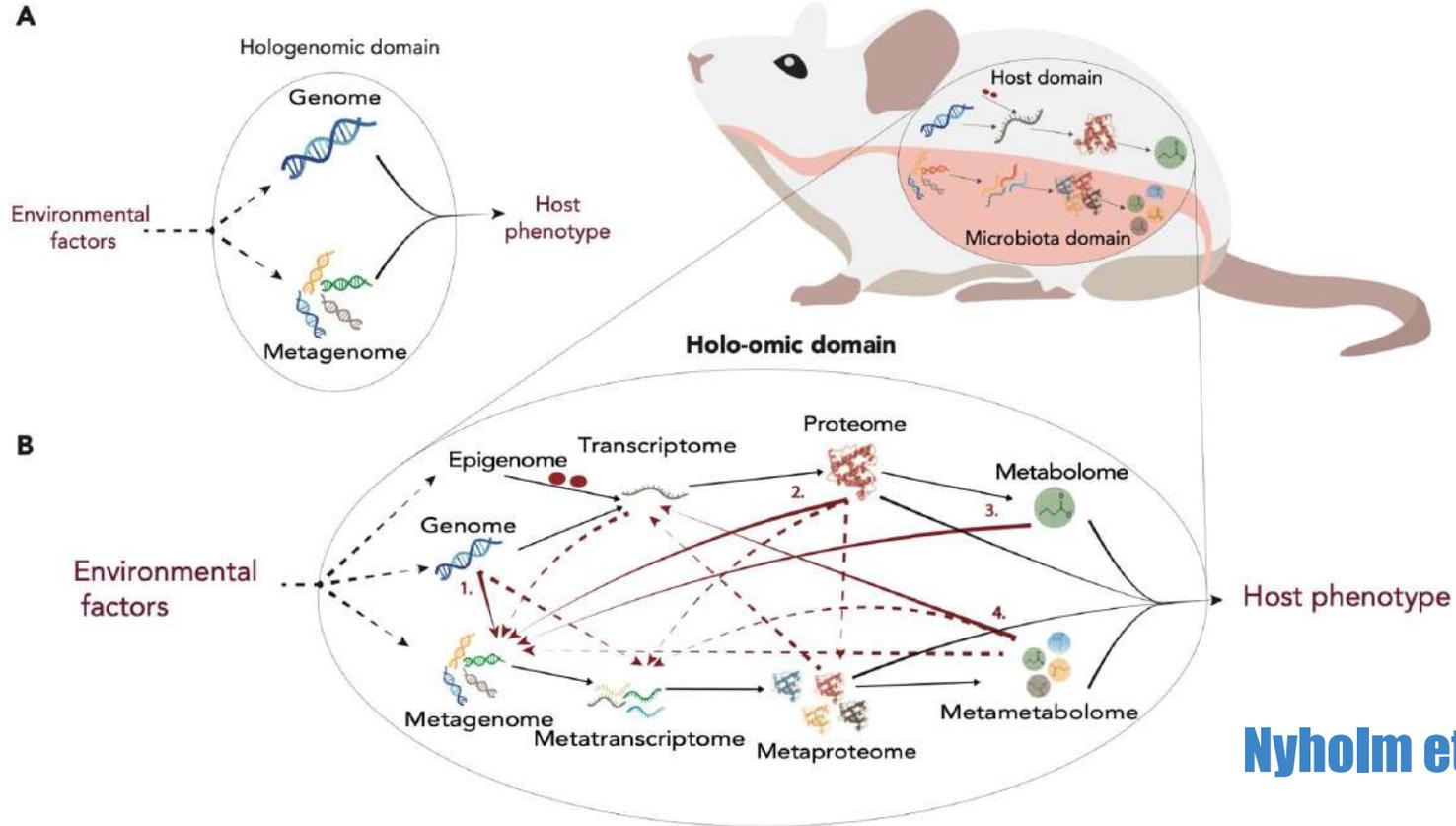
$$P = MG \times E$$

$$P = G \times MG \times E$$

$$P = G \times MG \times E$$

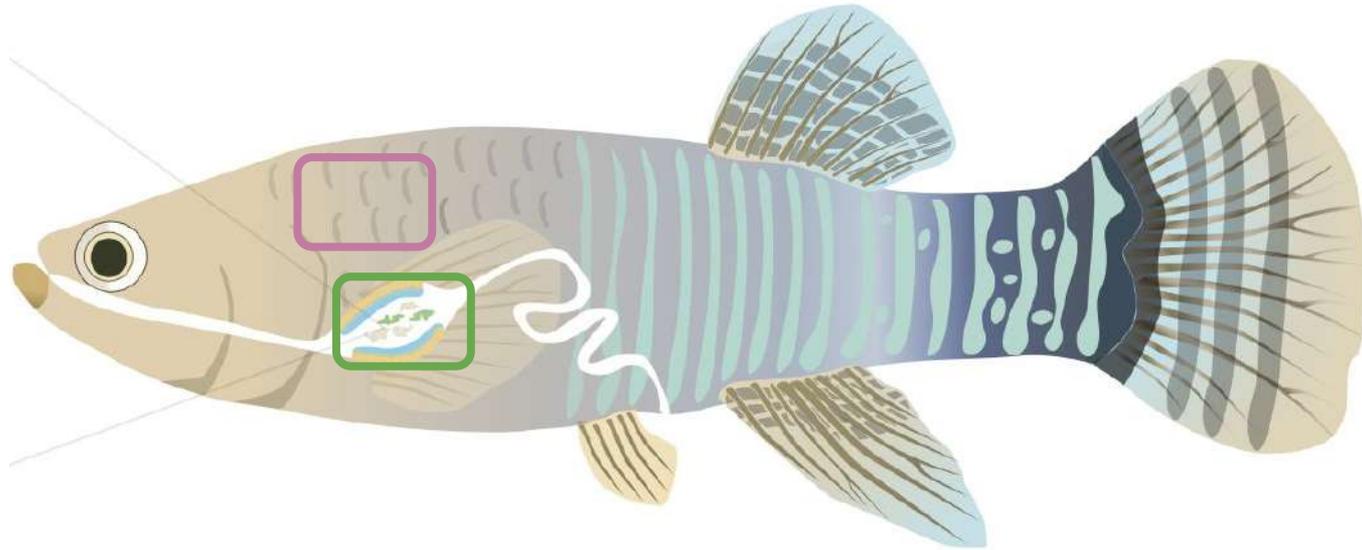
Interactions

Hologenomics



Sample collection preservation and extraction

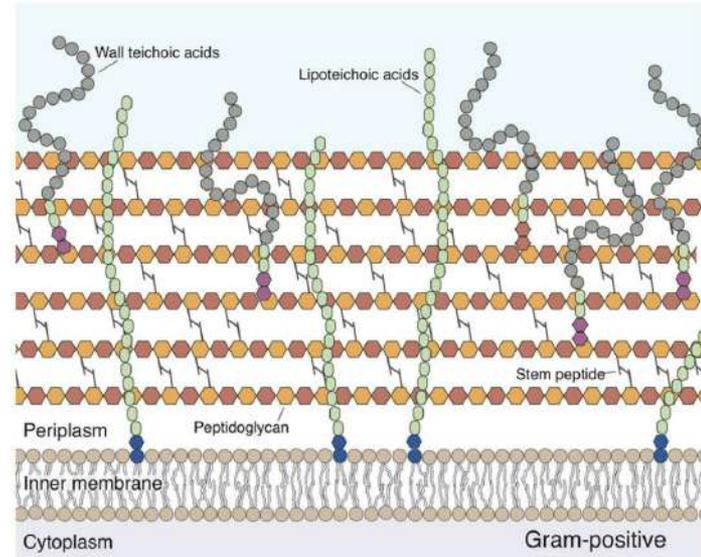
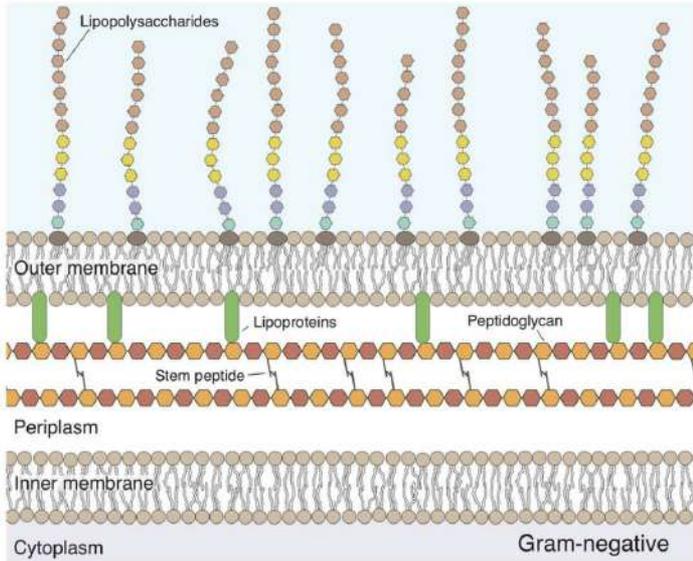
Hologenomics



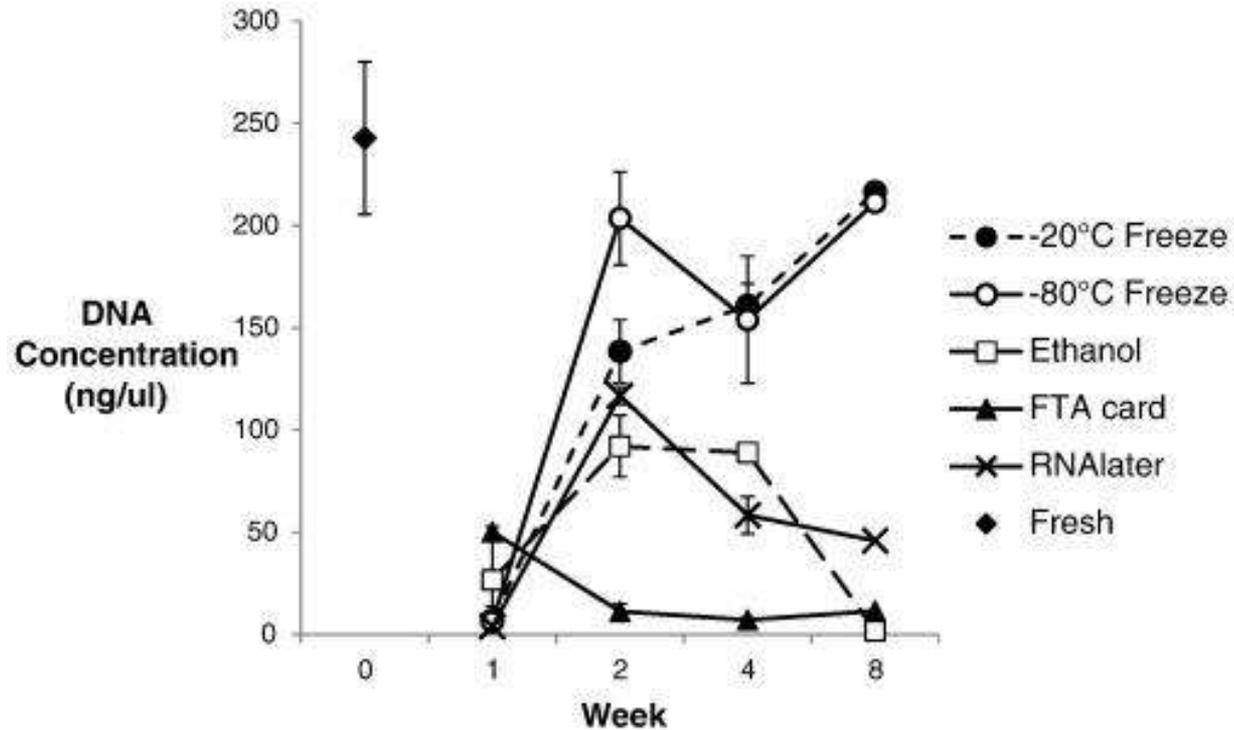
Microbial DNA

Host DNA

Hologenomics



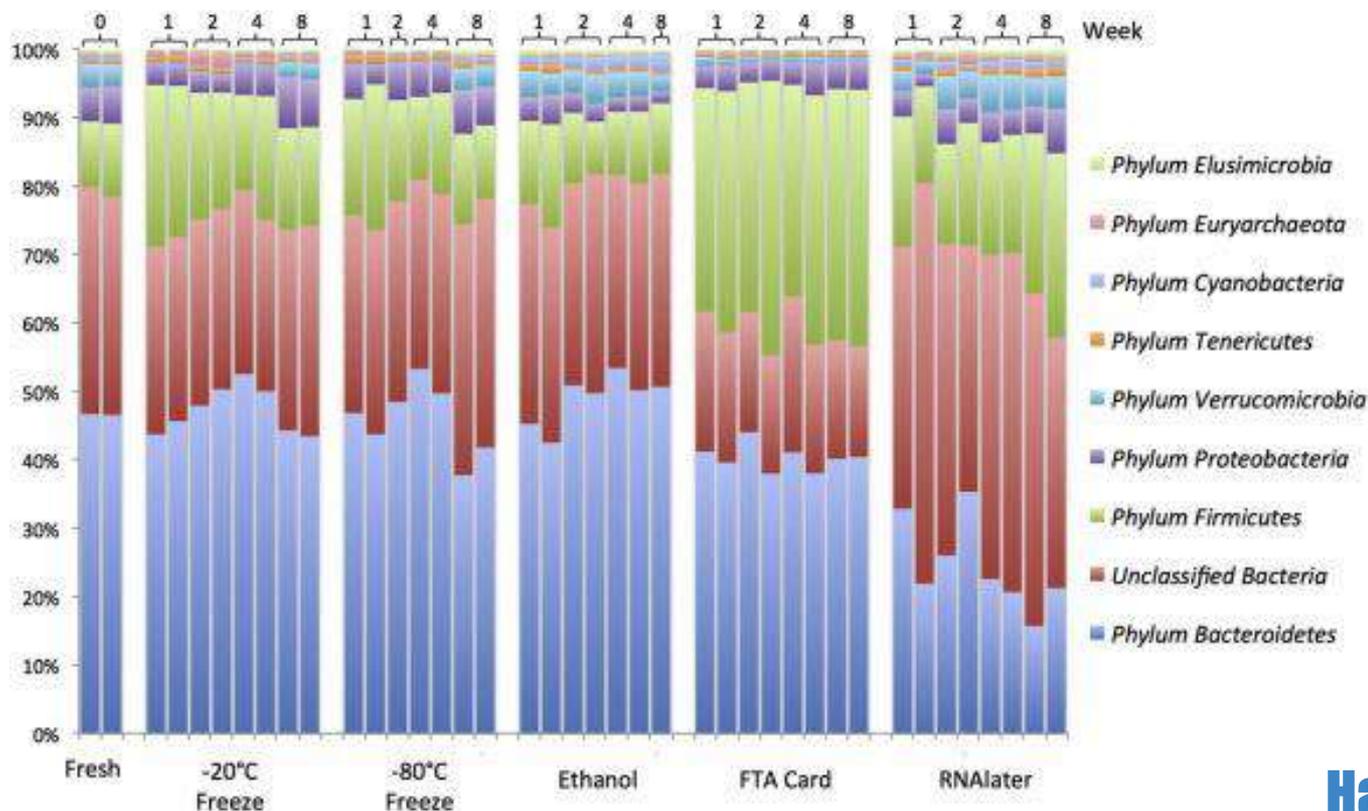
Hologenomics



Hologenomics



FishMed-PhD



Hale et al. 2015

Journal of Microbiological Methods

Ready-to-use tubes

Up to 162 sample collection tubes pre-labelled and pre-filled with preservation buffer.

Different-sized swabs

For sampling the oral cavity and anus of animals. Adjusted to the size of the targeted animals.



Sampling guidelines

Simple guidelines to ensure standardised sample collection and preservation.

Complementary material

Collaborators with limited resources can request complementary materials such as gloves, tweers or face masks.



How much sequencing?

Hologenomics



Lactobacillus

2 MB

2,000,000 bp

Enterococcus

3 MB

3,000,000 bp

Bacteroides

7 MB

7,000,000 bp

Illumina NovaSeq S4

800 GB

800,000 MB

Lactobacillus

2 MB

x400,000

Enterococcus

3 MB

x260,000

Bacteroides

7 MB

x114,000

Hologenomics



FishMed-PhD

Multiplexing

800 GB

Multiplexing

800 GB

8 GB											
------	------	------	------	------	------	------	------	------	------	------	------

288 libraries

Hologenomics



8 GB
8,000 MB

Lactobacillus

2 MB

x4,000

Enterococcus

3 MB

x2,600

Bacteroides

7 MB

x1,140

Host-bacterial fractions

8 GB

Host-bacterial fractions

8 GB

Host

Bacteria

Other

Host-bacterial fractions

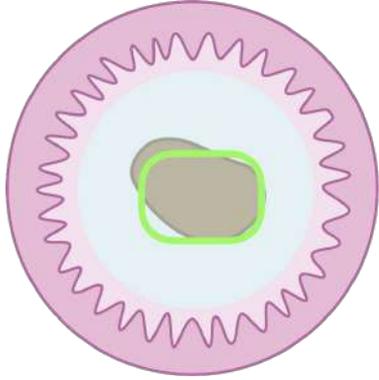


Host-bacterial fractions



Host-bacterial fractions



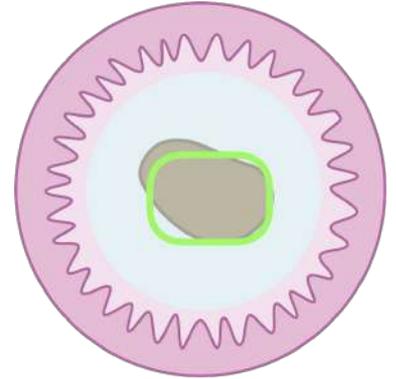


Ileum

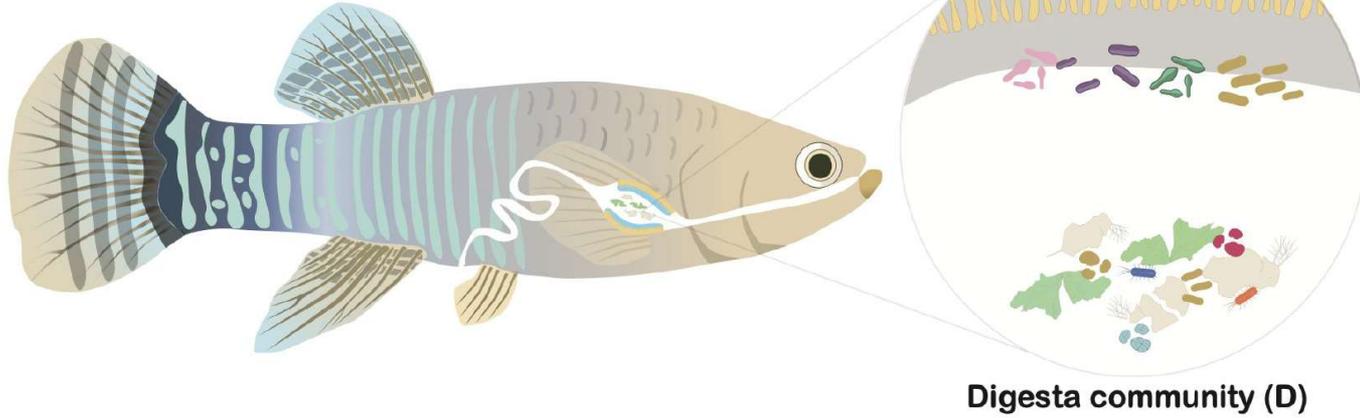
95% Host DNA

95% Microbial DNA

Caecum



Hologenomics



>99%
host

90-95%
host

Bioinformatic approach

Hologenomics



Raw reads

Filtered reads

Hologenomics



Raw reads

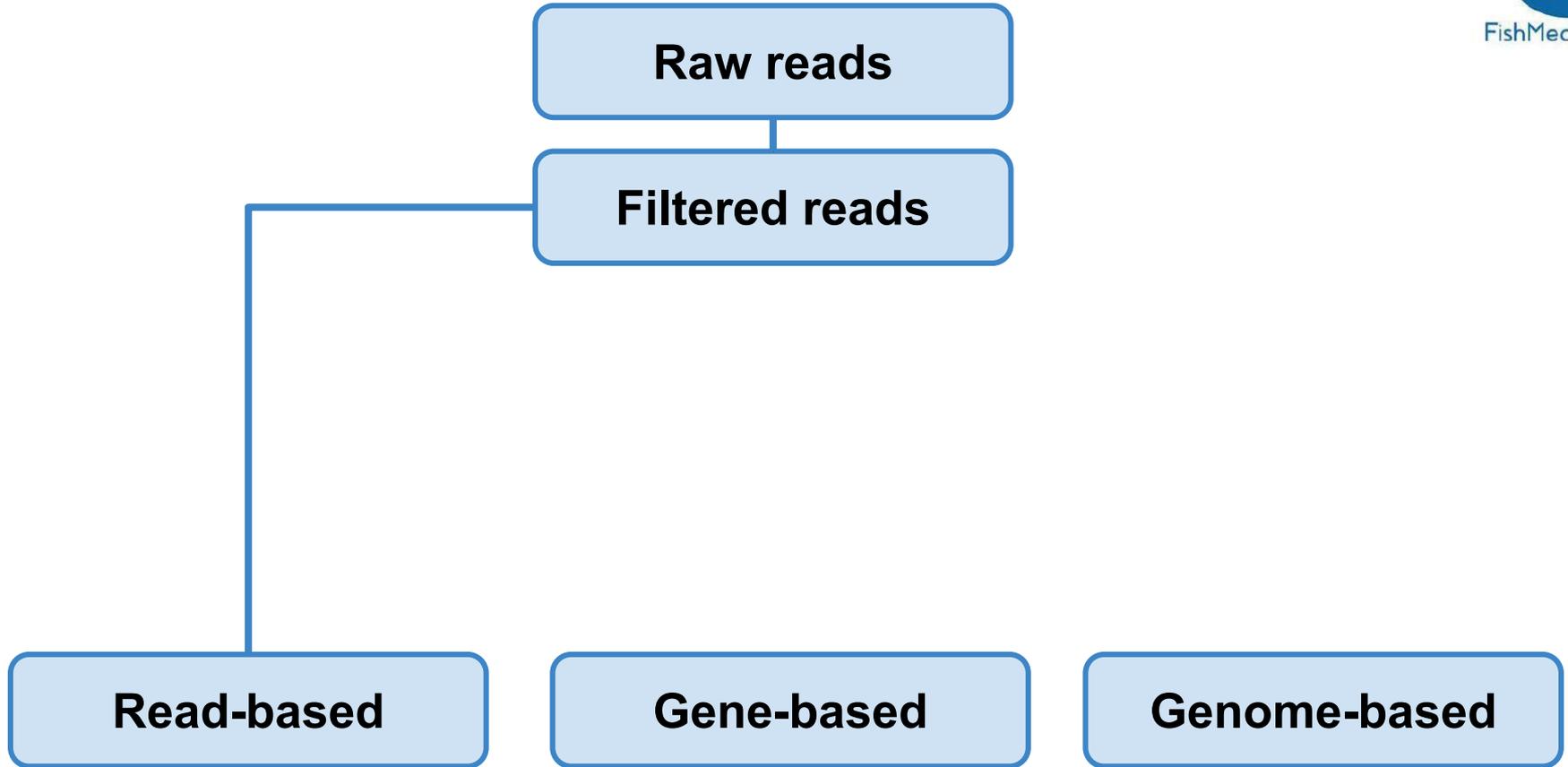
Filtered reads

Read-based

Gene-based

Genome-based

Hologenomics



Hologenomics

Read-based

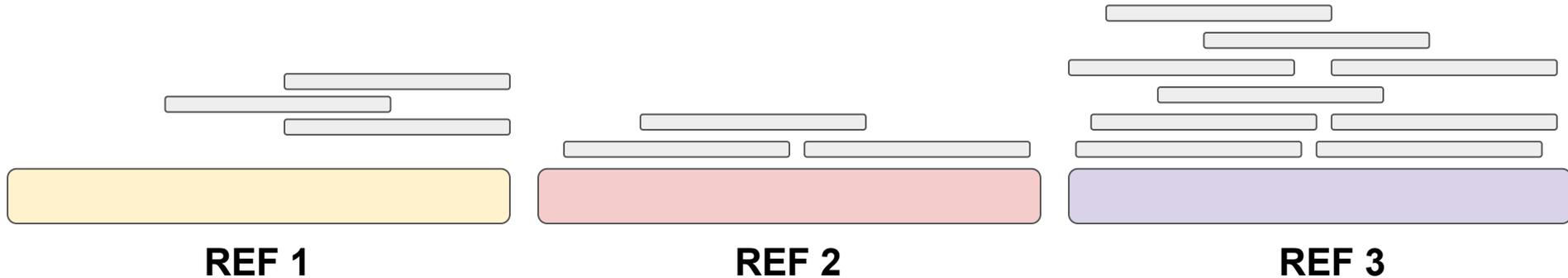


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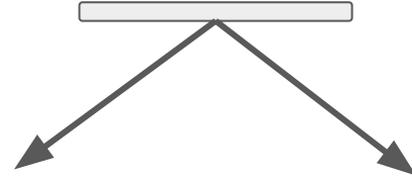
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REF 3

Read-based



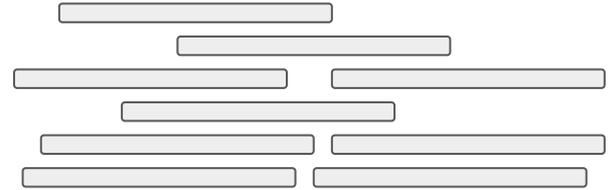
Read-based Ambiguity



REF 1



REF 2



REF 3

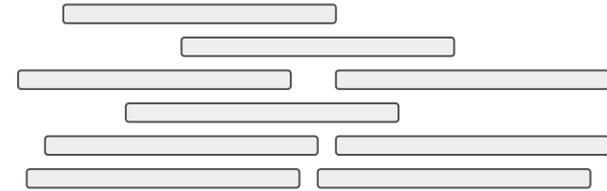
Read-based Reference DB



REF 1

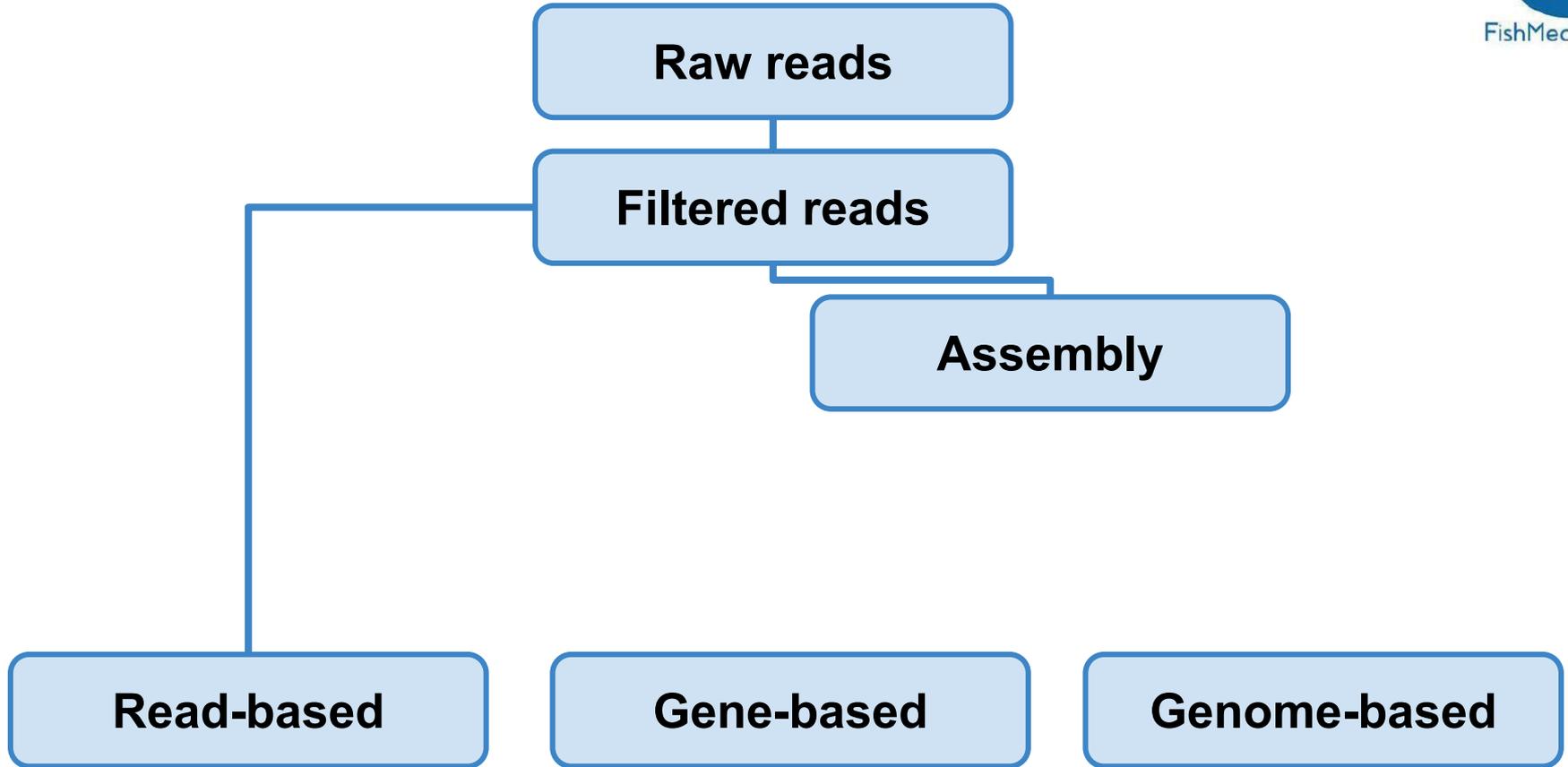


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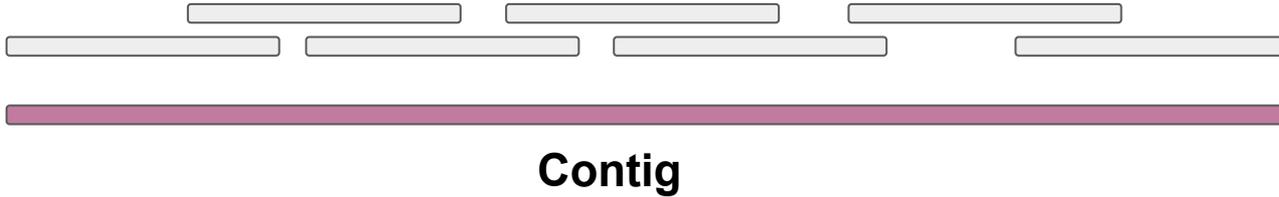


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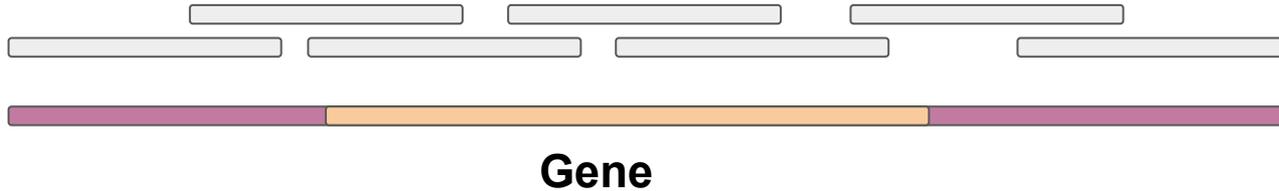
Hologenomics



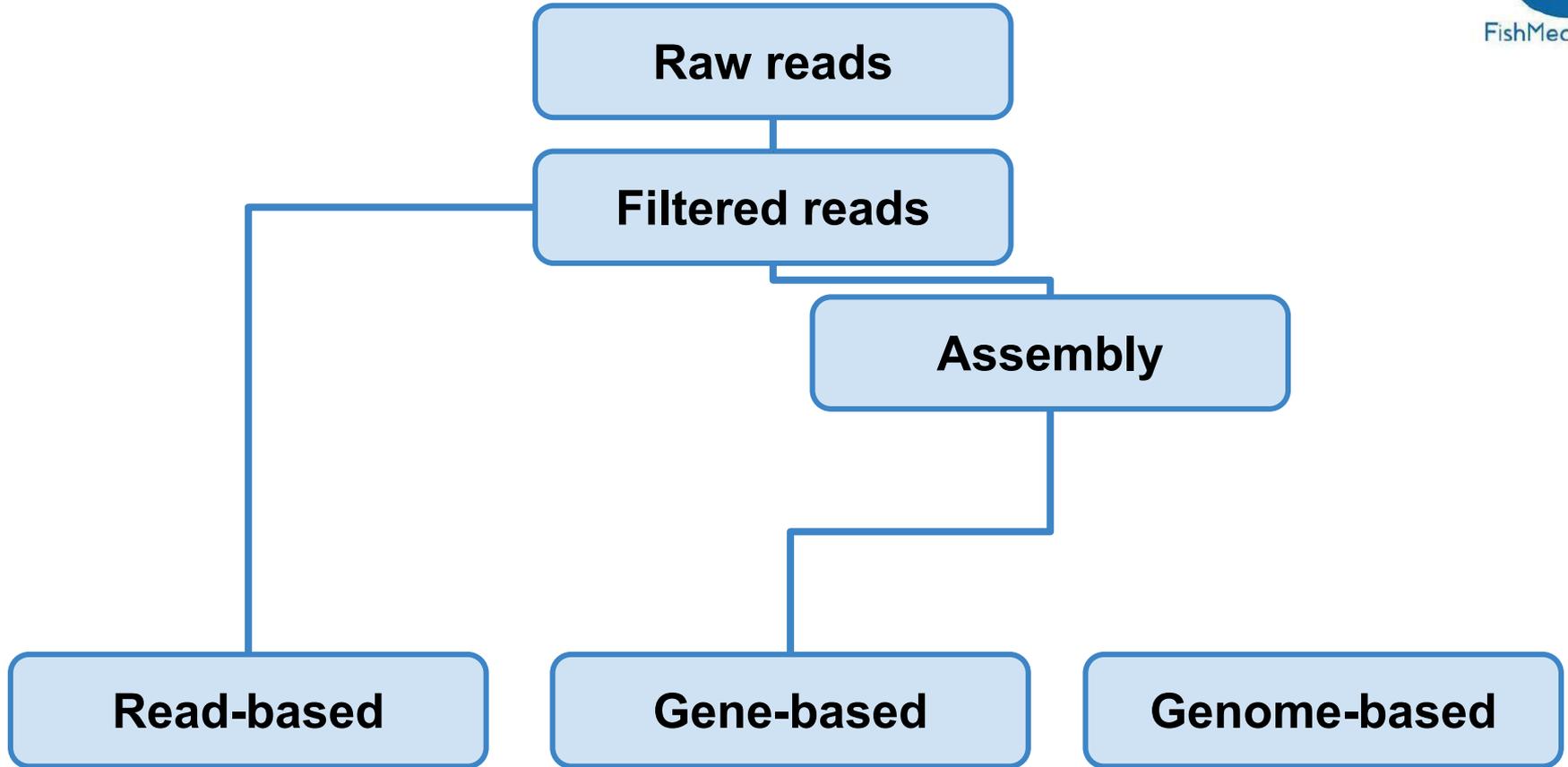
Assembly



Assembly Gene prediction



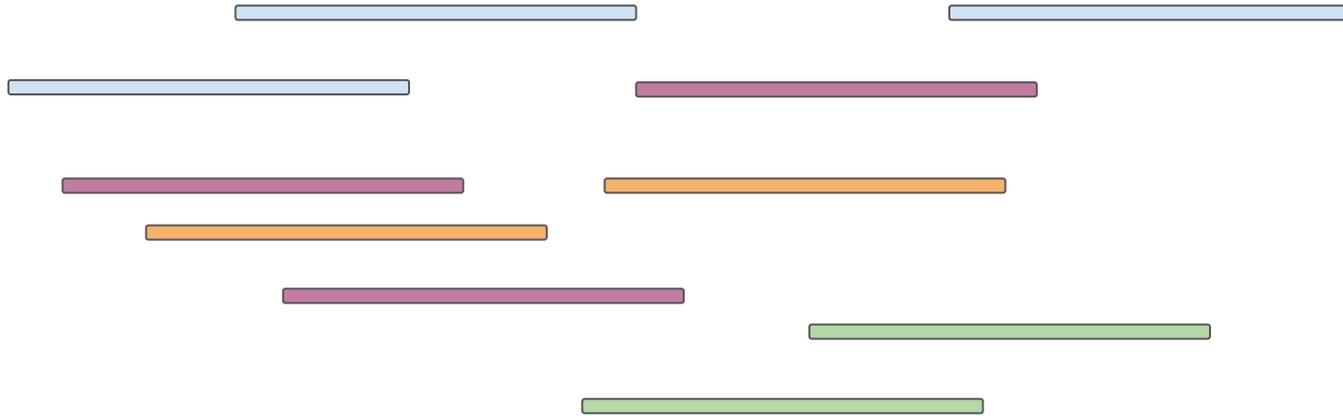
Hologenomics



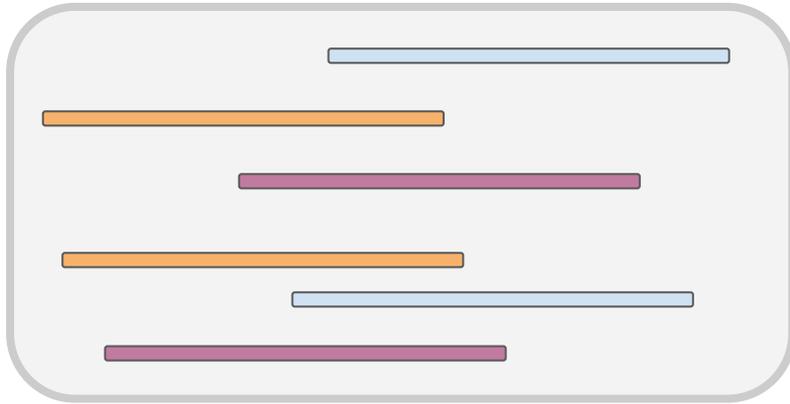
Hologenomics



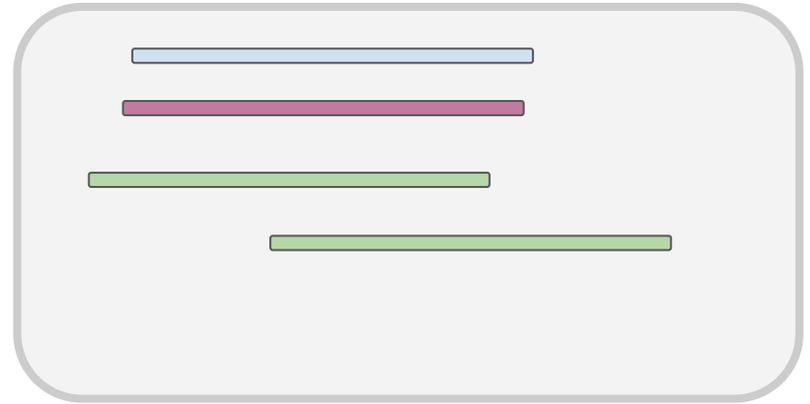
Gene-based



Gene-based

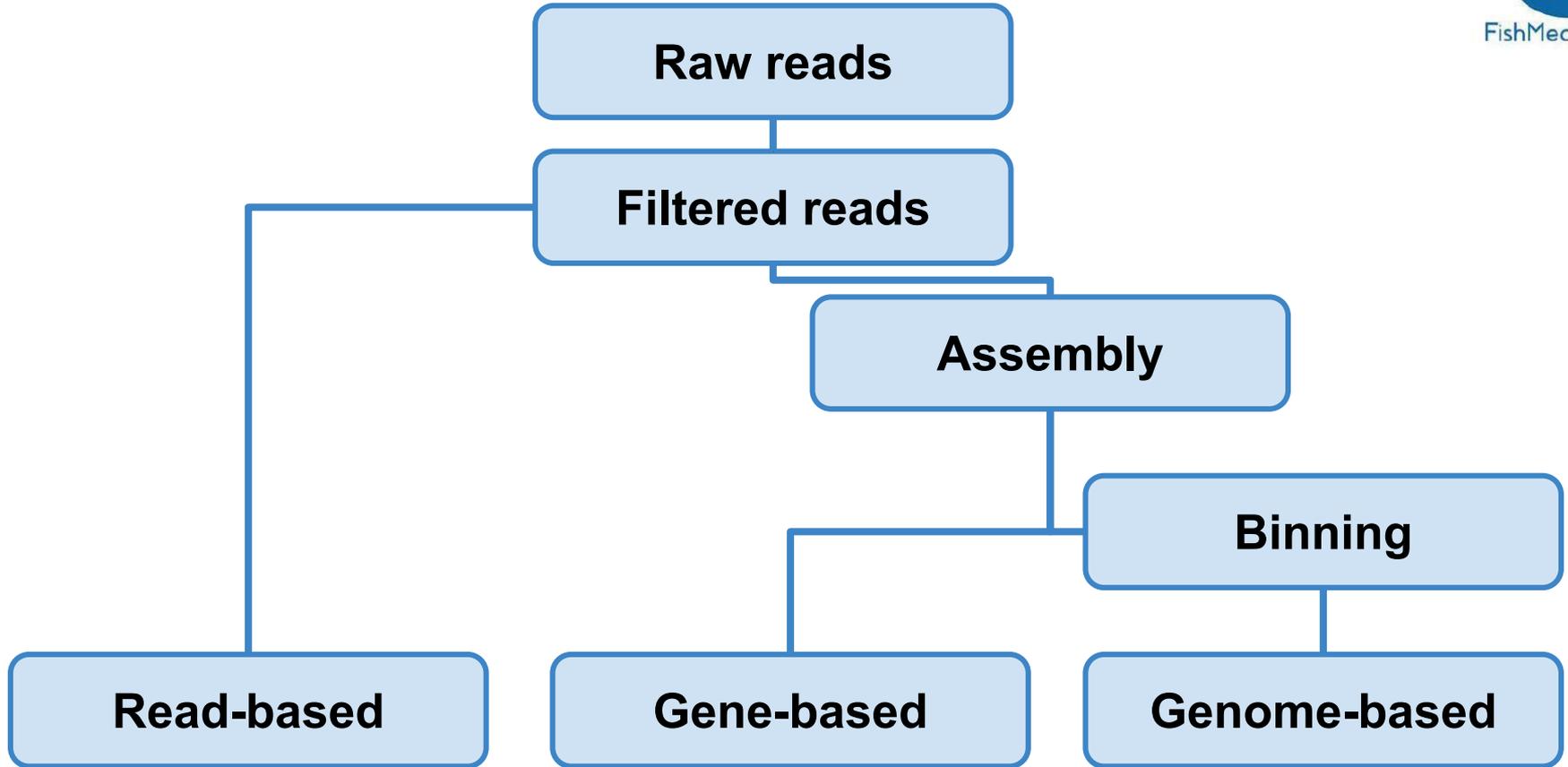


Genome 1

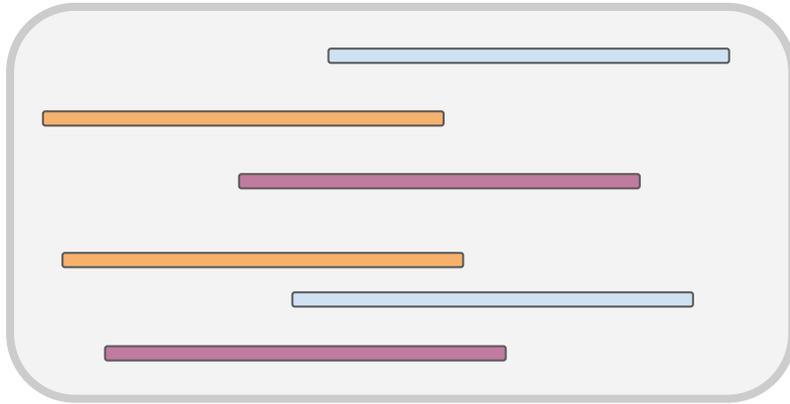


Genome 2

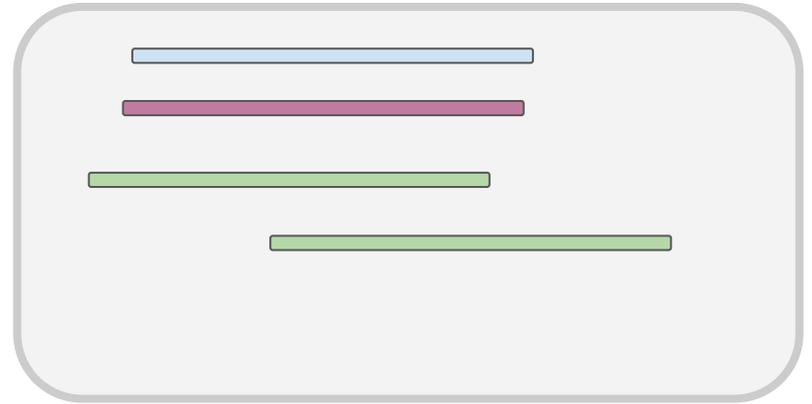
Hologenomics



Binning



Genome 1



Genome 2

Draft genomes

Genome 1

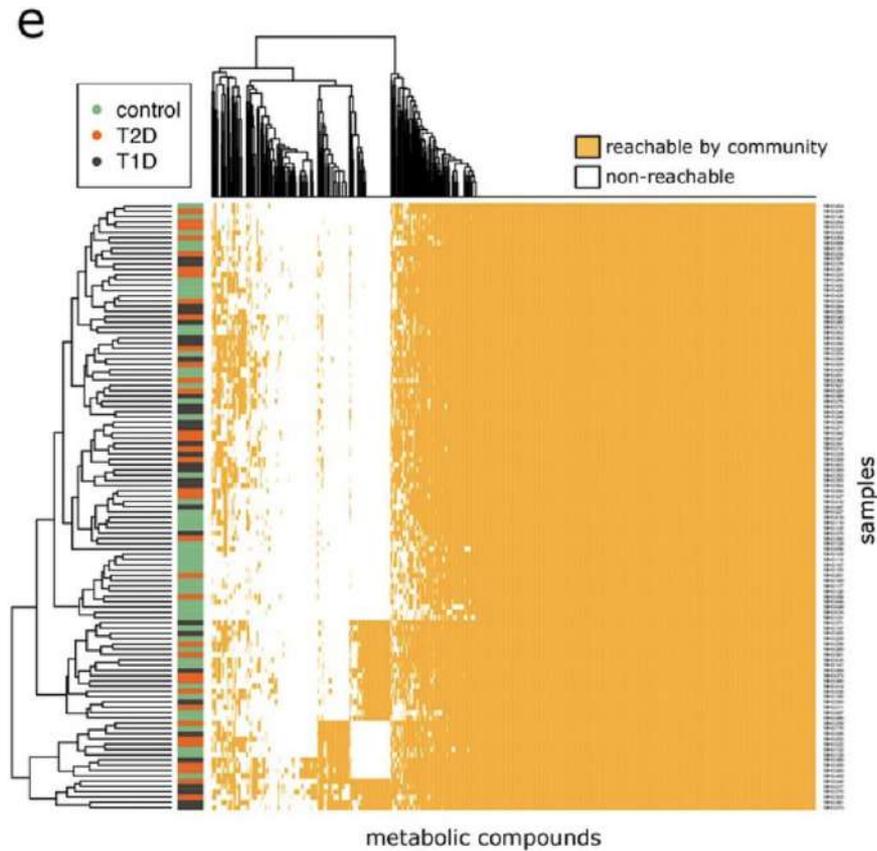


Genome 2



Hologenomics

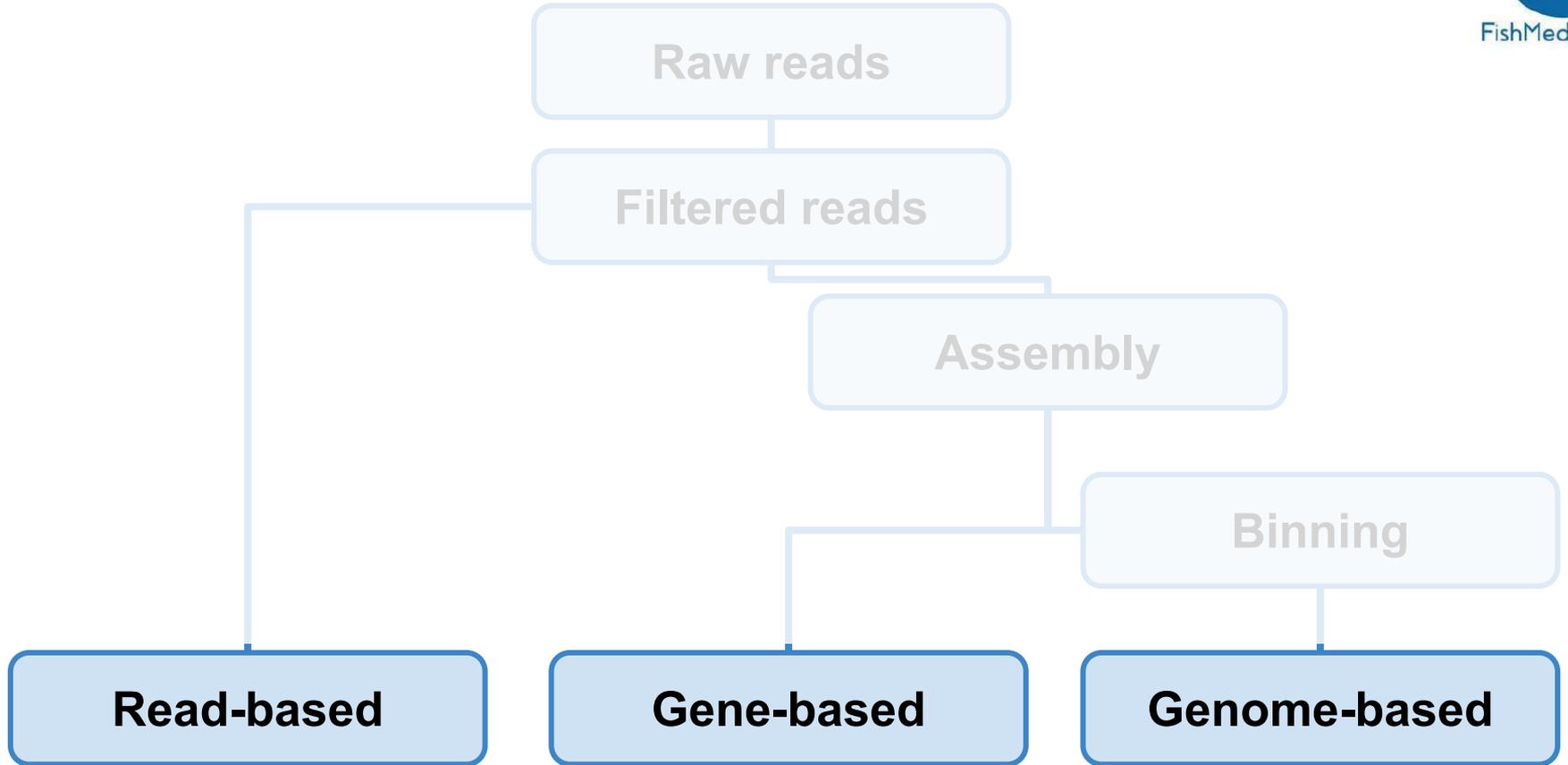
Genome- scale metabolic networks



Belcour et al. 2021

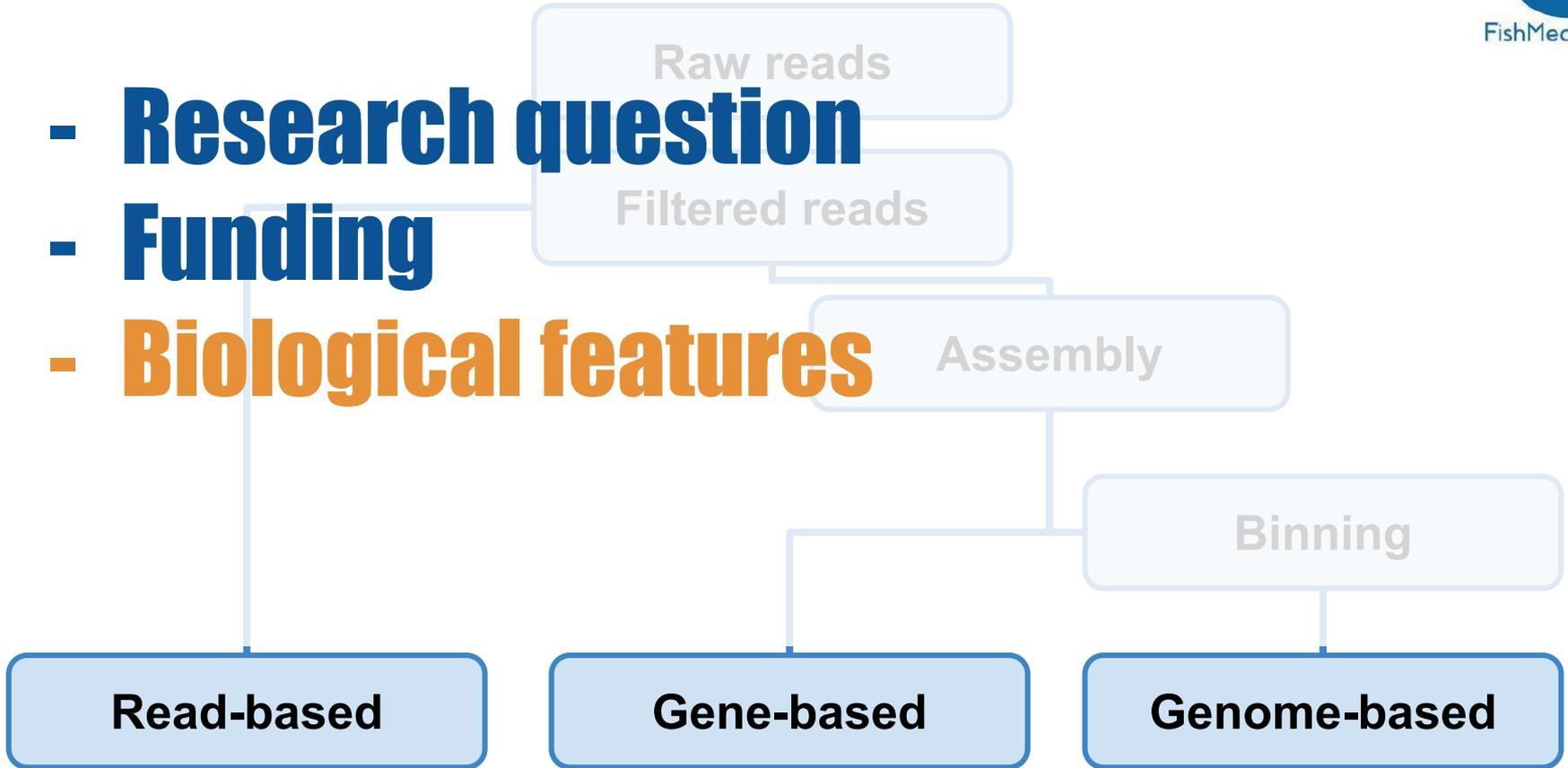
Elife

Hologenomics



Hologenomics

- **Research question**
- **Funding**
- **Biological features**



INTERESTING READINGS

Bacteria vs. host

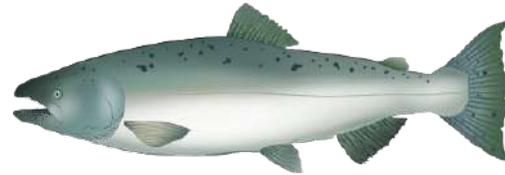
Enterococcus

3 MB

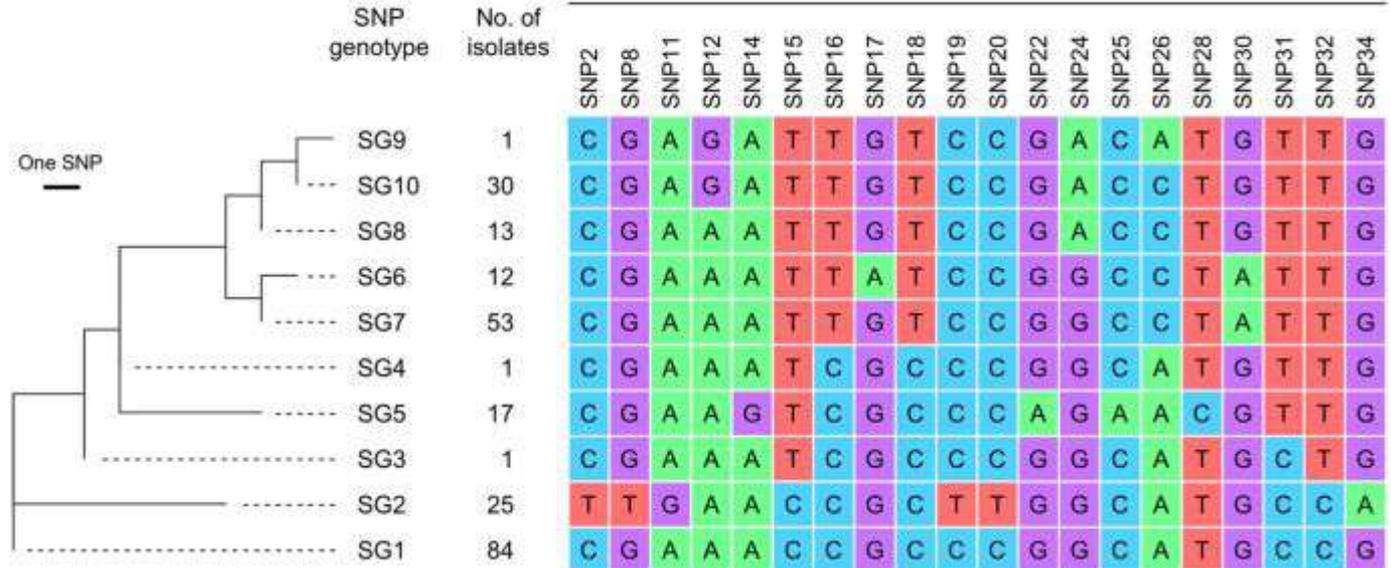


Salmo salar

3000 MB

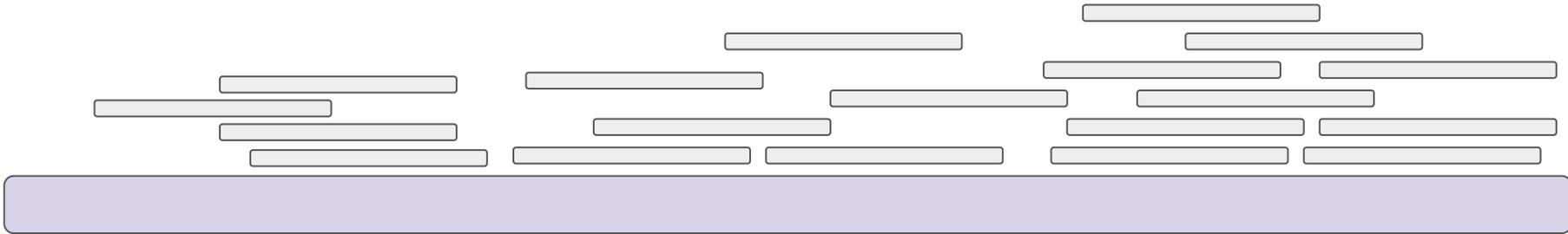


Host SNP profiles



Host SNP profiles

Depth



Host Genotype imputation

1	?	?	?	1	?	1	?	0	2	2	?	?	2	?	0
0	?	?	?	2	?	2	?	0	2	2	?	?	2	?	0
1	?	?	?	2	?	2	?	0	2	1	?	?	2	?	0
1	?	?	?	2	?	1	?	1	2	2	?	?	2	?	0
2	?	?	?	2	?	2	?	1	2	1	?	?	2	?	0
1	?	?	?	1	?	1	?	1	2	2	?	?	2	?	0
1	?	?	?	2	?	2	?	0	2	1	?	?	2	?	1
2	?	?	?	1	?	1	?	1	2	1	?	?	2	?	1
1	?	?	?	0	?	0	?	2	2	2	?	?	2	?	0

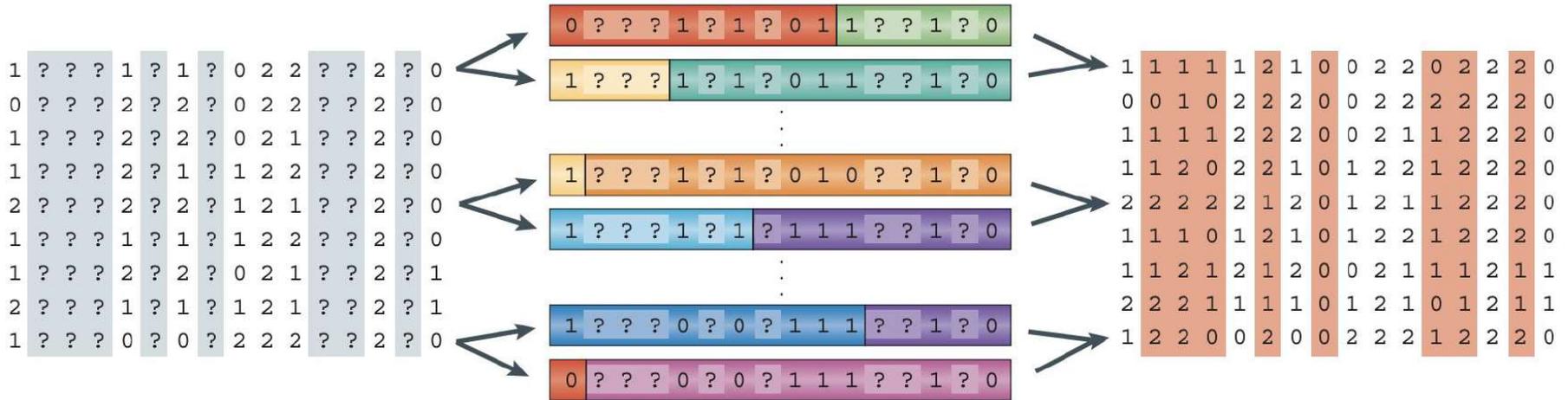
Host Genotype imputation

1	?	?	?	1	?	1	?	0	2	2	?	?	2	?	0
0	?	?	?	2	?	2	?	0	2	2	?	?	2	?	0
1	?	?	?	2	?	2	?	0	2	1	?	?	2	?	0
1	?	?	?	2	?	1	?	1	2	2	?	?	2	?	0
2	?	?	?	2	?	2	?	1	2	1	?	?	2	?	0
1	?	?	?	1	?	1	?	1	2	2	?	?	2	?	0
1	?	?	?	2	?	2	?	0	2	1	?	?	2	?	1
2	?	?	?	1	?	1	?	1	2	1	?	?	2	?	1
1	?	?	?	0	?	0	?	2	2	2	?	?	2	?	0

0	0	0	0	1	1	1	0	0	1	1	1	1	1	1	0
1	1	1	1	1	1	1	0	0	1	0	0	1	1	1	0
1	1	1	1	1	0	1	0	0	1	0	0	0	1	0	1
0	0	1	0	1	1	1	0	0	1	1	1	1	1	1	0
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0	0	0	0	1	1	1	0	0	1	1	1	1	1	1	0
1	1	1	0	0	1	0	0	1	1	1	0	1	1	1	0

Host Genotype imputation

Marchini & Howie 2010
Nature Reviews Genetics



INTERESTING READINGS

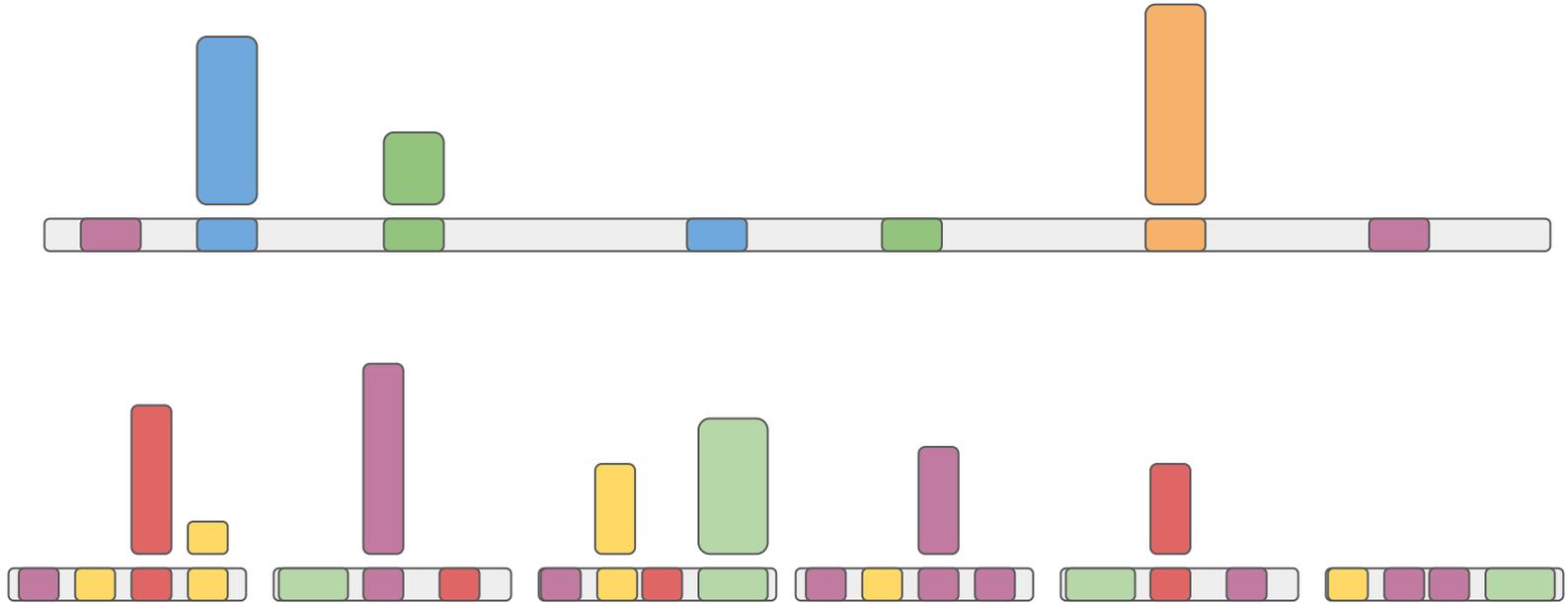


Hologenomics



**Is there any other
relevant information we
are missing?**

Gene expression

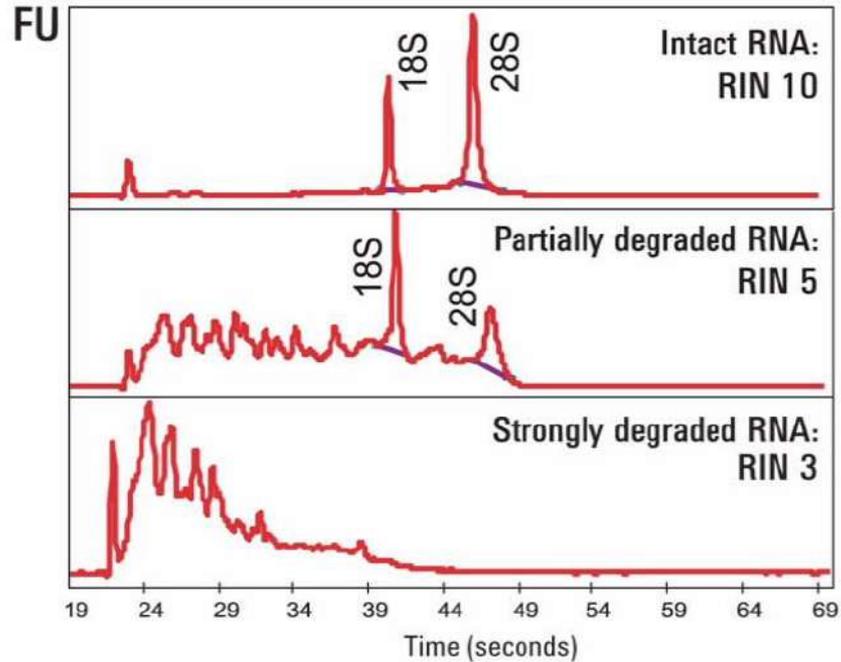


Gene expression

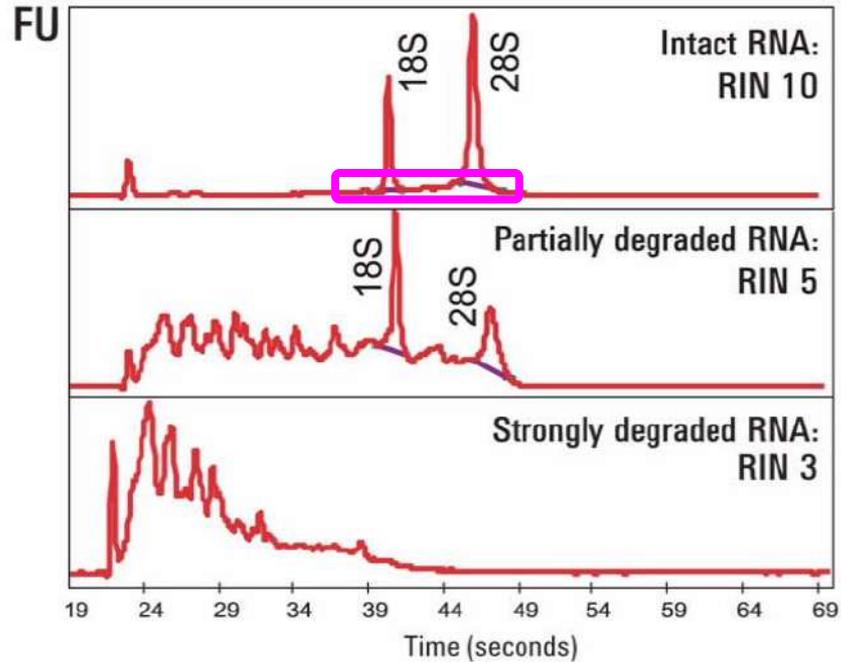
Challenges

- RNA preservation
- rRNA depletion

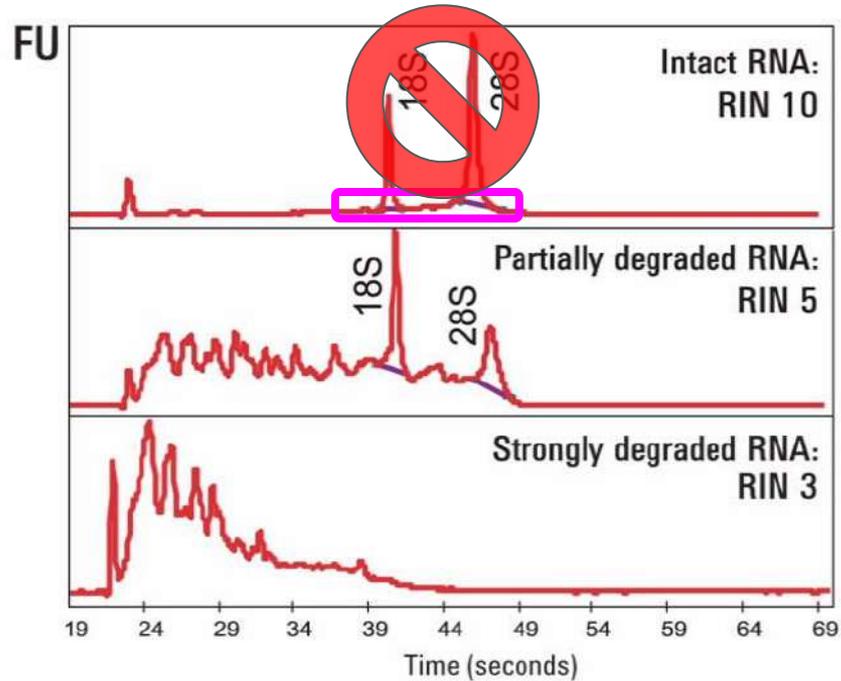
Gene expression



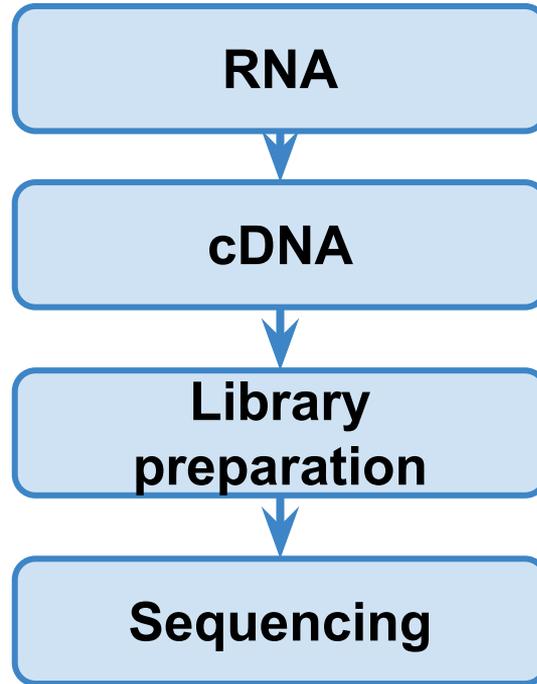
Gene expression



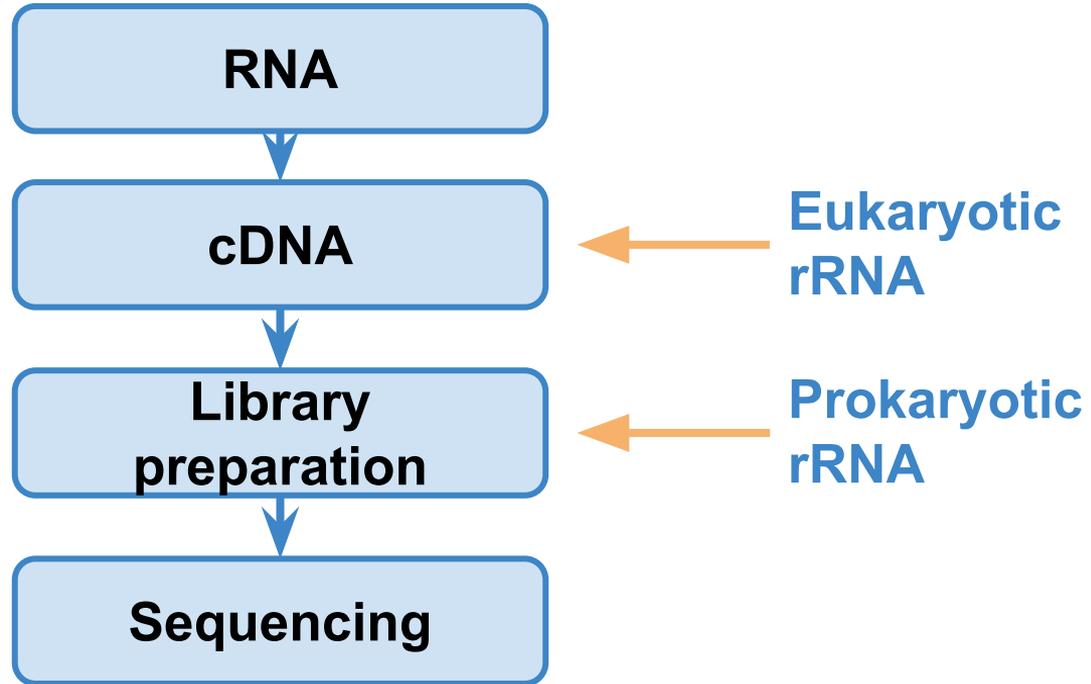
Gene expression



Gene expression

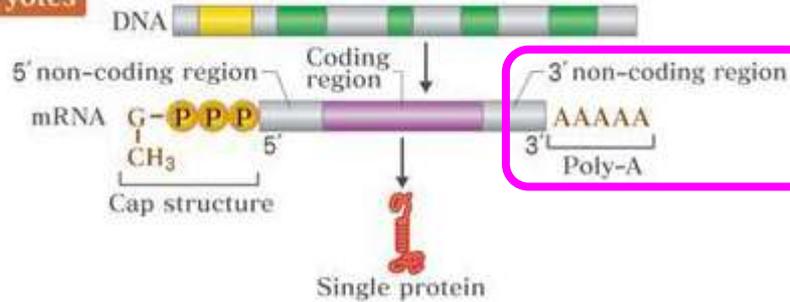


Gene expression

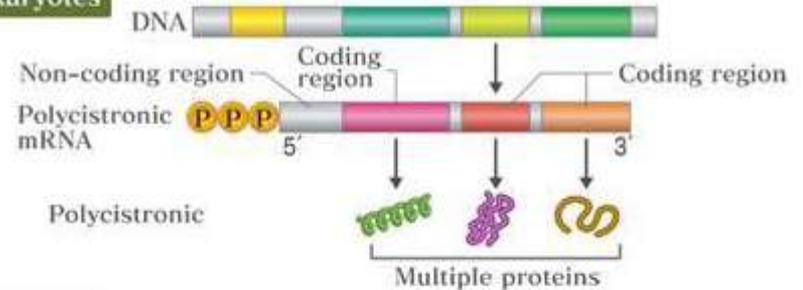


Gene expression

Eukaryotes



Prokaryotes



Hologenomics

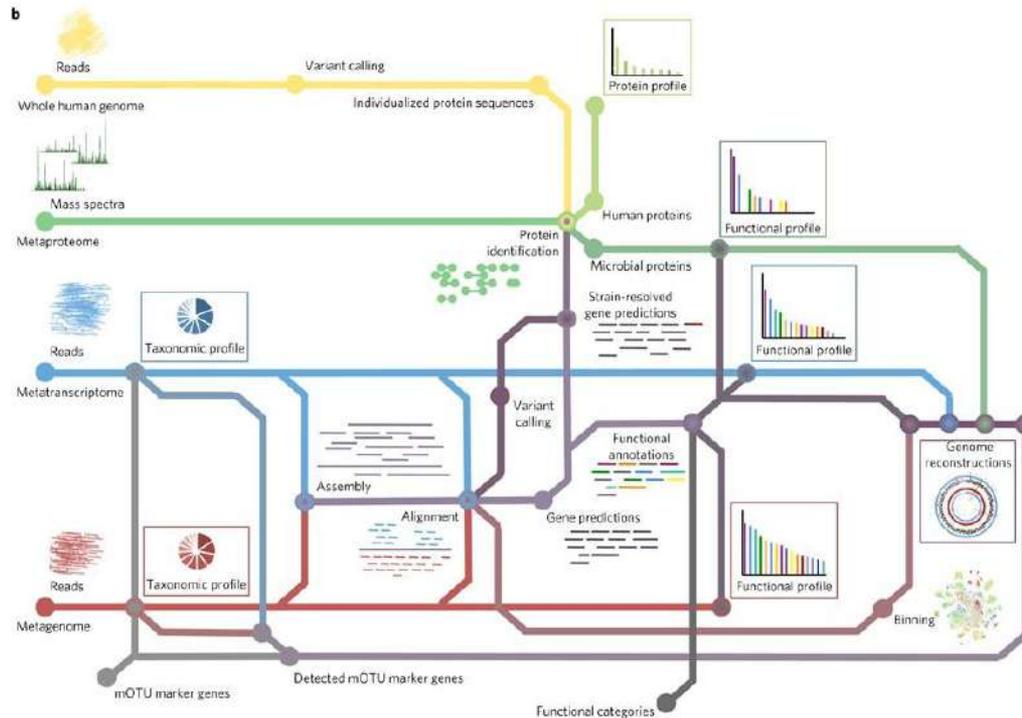


FishMed-PhD

Mass spectrometry-based

Proteomics
Metabolomics

Data integration



Heintz-Buschart et al. 2016
Nature Microbiology



Hologenomics

applied to host-microbiota interactions
in marine organisms

Antton Alberdi

University of Copenhagen

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alberdilab.dk



CENTER FOR
EVOLUTIONARY
HOLOGENOMICS



UNIVERSITY OF
COPENHAGEN

Session 4

APPLICATIONS of knowledge on animal- microbiota interactions

When and how should we implement hologenomics?

Complex
Expensive

Hologenomics



FishMed-PhD

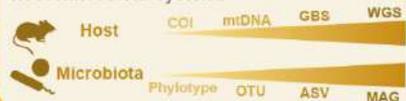
Which variables can be controlled by the researcher?

What information can be recovered from host-microbiota systems will depend on whether, and to what degree, host genomic, microbial metagenomic and environmental complexity can be controlled, minimised or removed by the researcher.



What is the genomic resolution at which hologenomic variation is studied?

The resolution at which the host genome and the microbial metagenome are characterised, and in consequence how genotypes, metagenotypes and combined hologenotypes are defined, also determines the genomic level of complexity to study a host-microbiota system.



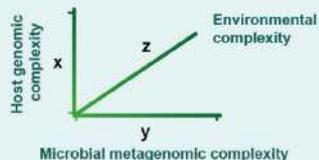
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Which questions can be addressed also depends on the intrinsic spatial and temporal features of hosts and microbial communities considered, as well as the spatial and temporal features of the study design.



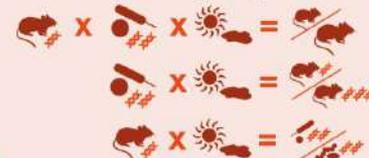
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2

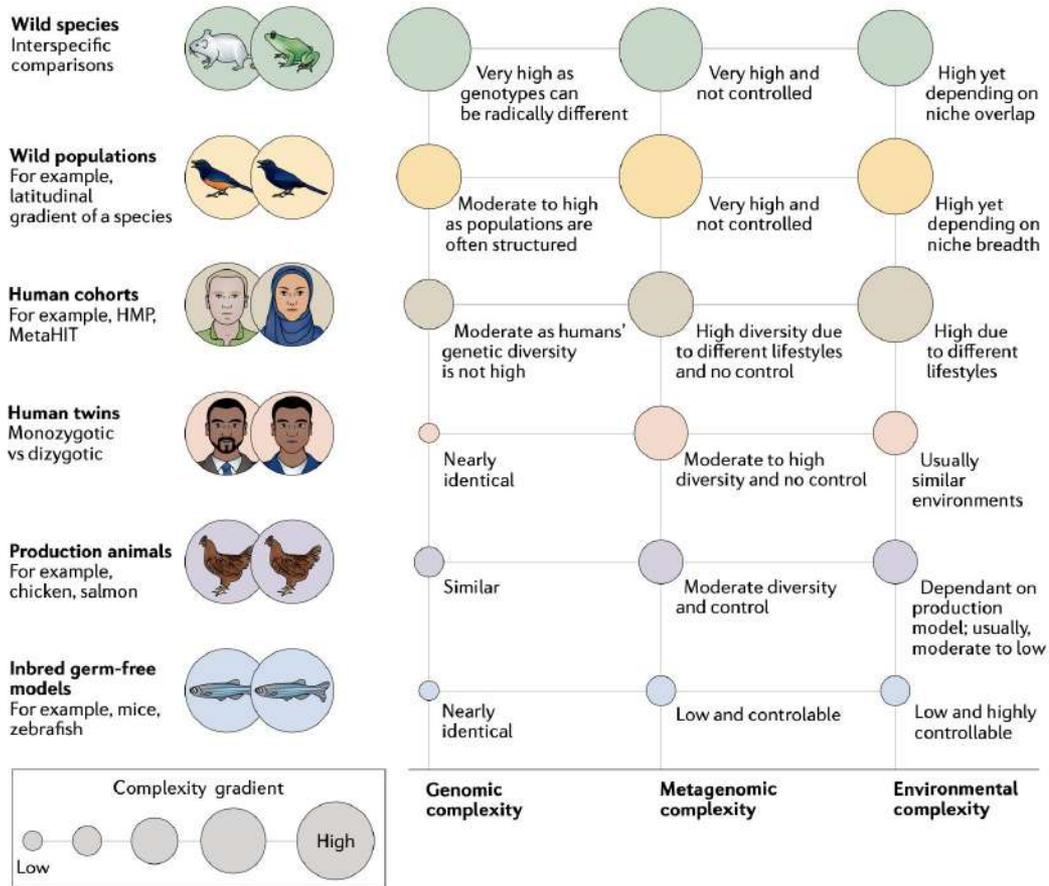
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4

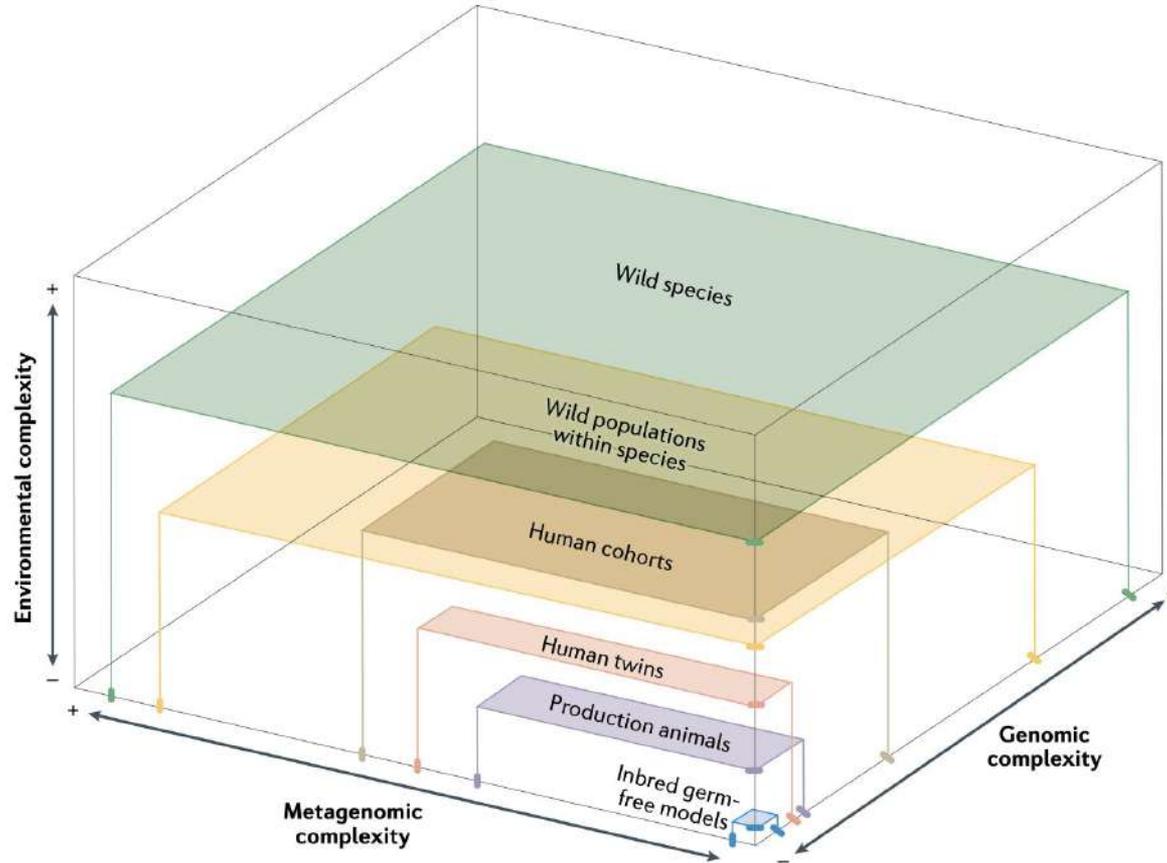
1

5

Hologenomics



Hologenomics



Hologenomics



FishMed-PhD

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When? How often? For how long?

What is the complexity of the study system?

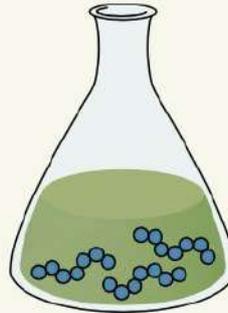
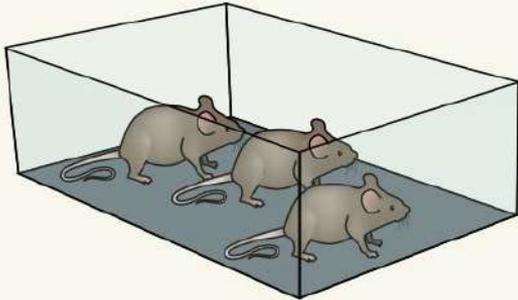
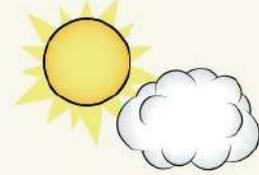
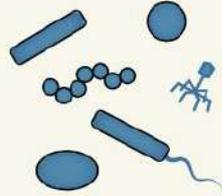
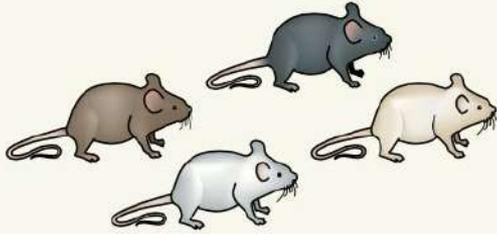
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Hologenomics



FishMed-PhD

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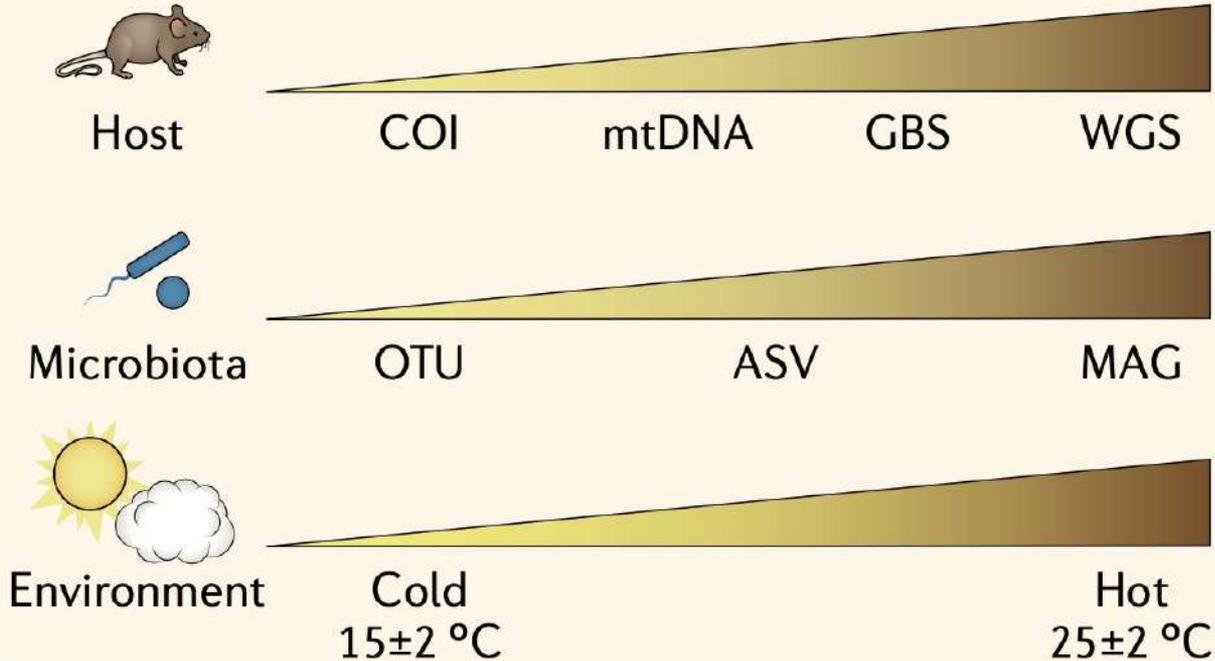
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Hologenomics



FishMed-PhD

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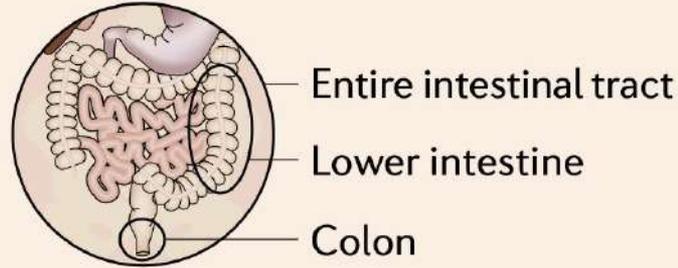
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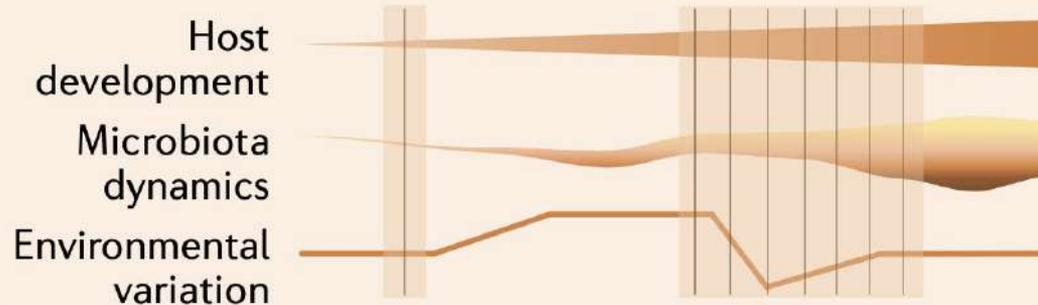


④ **What are the spatiotemporal features of the studied hologenomic variation?**

Spatial features



Temporal features: when, how often and for how long



Hologenomics



FishMed-PhD

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The complexity of a hologenomic system can be decomposed into three elements: the host genomic complexity, the microbial metagenomic complexity and the environmental complexity.

Which are the explanatory and response variables?

Due to the multi-layered nature and bi-directional interactions in host-microbiota systems, the definition of explanatory and response variables, and thus the question researchers want to answer, will often be determined by the study design.



$$P = G \times MG \times E$$

G ~ **MG** x **E**

MG ~ G x E

**Which research questions
could be tackled with
hologenomics?**

- **Effect of host-microbiota interactions on production**
- **Joint variations of domestication process to genomes and metagenomes**
- **Joint (genomic+metagenomic) means of adaptation to environmental change**
- **...**