



# Microbiome Analytics

Machine Learning &  
ActiveEon Orchestration On-  
Prem and On-Clouds

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 **27 février 2020**

« Un check-up de l'IA pour la santé numérique, c'est grave docteur(s) ? »

by **INRAE**



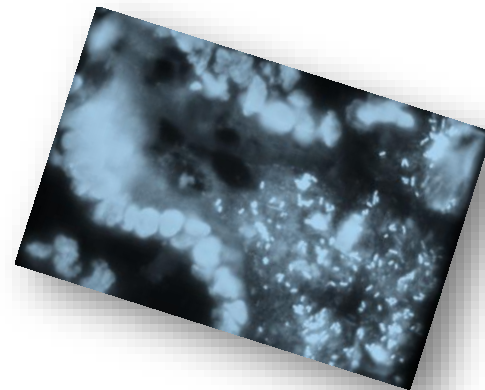
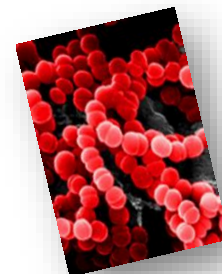
# Our microbiota, a neglected organ...

100 000 000 000 microorganisms; 10 times more than cells in our own body, up to 2kg of our weight

A key actor between food and our body

In contact with the largest group of immune system cells, the second for neuronal cells (our second brain!)

**...and a major actor in well-being, health and disease!**





MetaGenoPolis (MGP) is an INRAE center expert in gut microbiome research applied to health and nutrition.

In collaboration with industry, academia and clinics, MGP conceives and implements projects tailored to the partner's need.

PIA Winner: 19 M€ grant (2012-2019)  
5.7 M€ grant (2020-2025)

Identification of bacterial biomarkers associated with dysbiosis: microbiome signatures used as a diagnostic or prognostic tools.

Effects of drugs on the gut microbiome composition and functions

Stratification of individuals to a better personalized medicine: microbiome responders vs non responders

Identification of bioactive compounds (anti-inflammatory, antiproliferative, satigenic)

Impact of drugs on the level of intestinal antibiotic resistance genes

Identification of microbial genes & metabolites able to interact with human cells (metabolic pathways, mechanisms of regulation...)





Software Vendor with  
worldwide references:



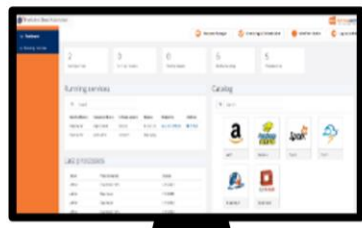
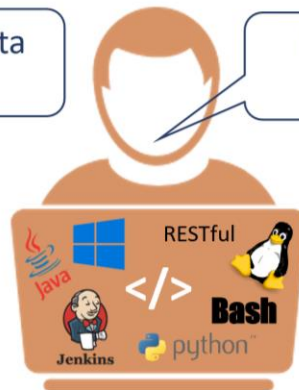
# Big Data + AI Solution

## Key Features:

- No need to split your HPC Cluster
- Works with Slurm, PBS, LSF, & on various Premises, and Clouds
- Portals for all and New Kinds of Users
- Support Containers
- Secured On-Demand Services & GUI
- Ease of access to efficient execution, e.g. RDMA, Horovod, etc.
- An Open Platform!



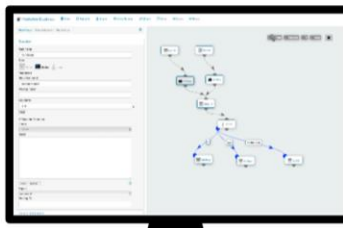
# Portals & Workflows for All



Automation Dashboard



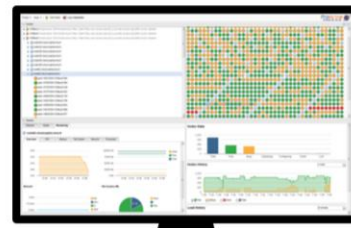
API / CLI



Workflow Studio



Scheduler



Resource Manager



Self-Service Catalog



Monitoring and Automation



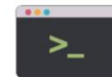
Workflows



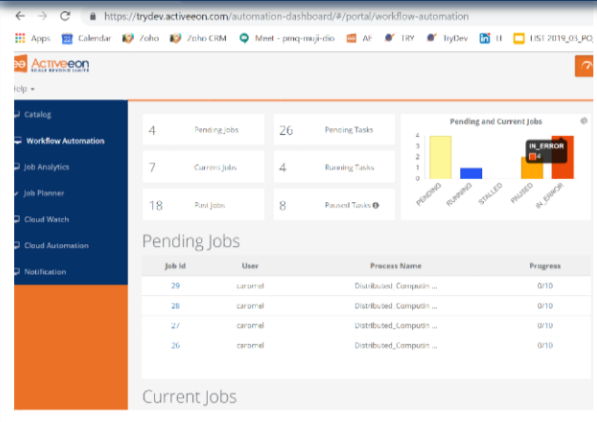
Scheduler



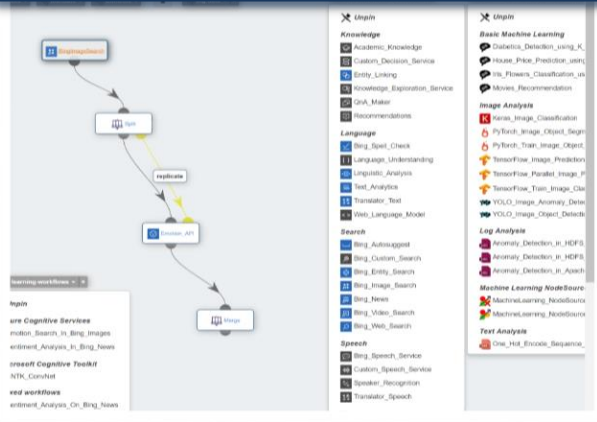
Resource Manager



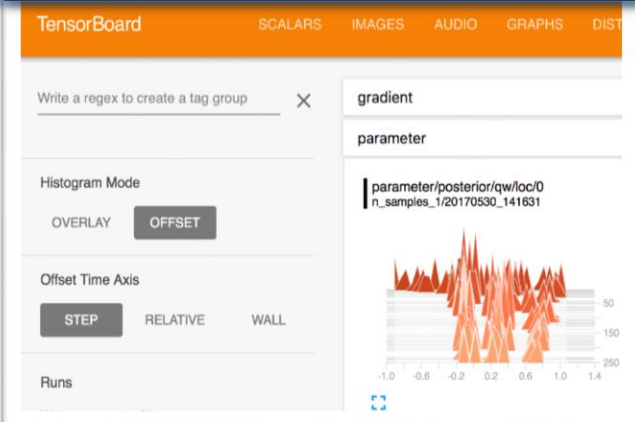
## Automation Dashboard



## AI Studio & Data Connectors



## User-defined GUI Services



## Python, Jupyter Integration

```

jupyter proactive-test Last Checkpoint: 05/29/2019 (autosaved)

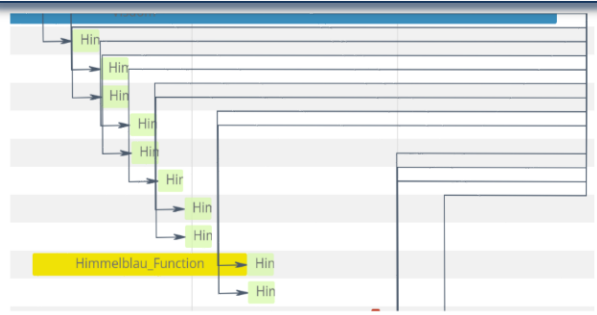
File Edit View Insert Cell Kernel Widgets Help

In [1]: #@connect(path=../proactive_config.ini)

WARNING: Proactive is already connected.
Disconnecting from server: http://try.activeeon
Connecting to server ...
Connected as 'narbais'

In [2]: #@job(name=MyFirstWfFromJupyter)
    
```

## Job Dependencies - Gantt



## Integrated Job Analytics



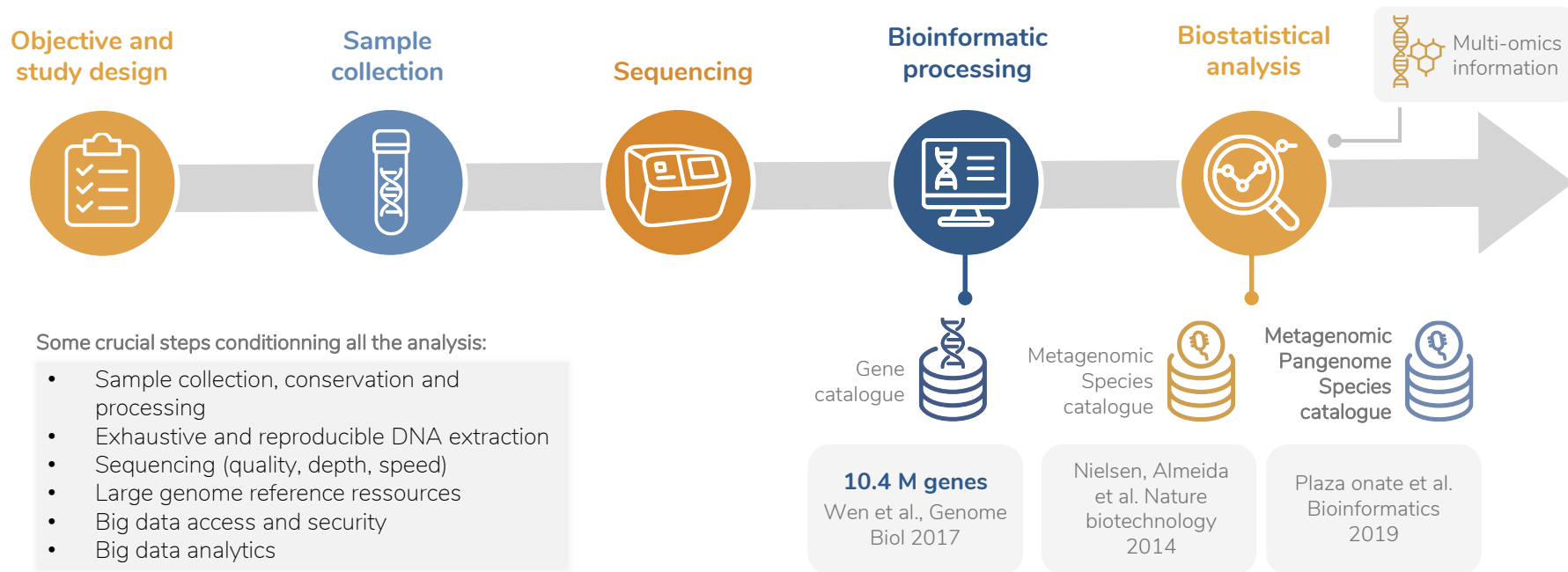


# Microbiota as a clinical tool

Bringing Artificial Intelligence in microbiome

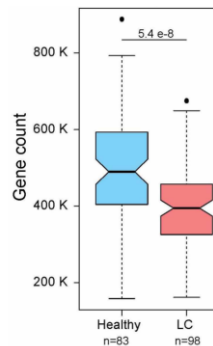
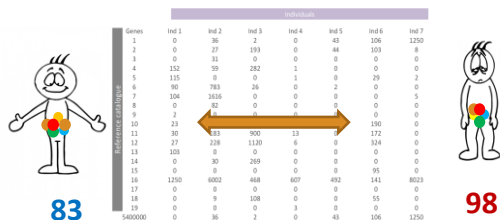
# Acurate profiling with high resolution microbiome analysis

Integrated metagenomic pipeline, exhaustive analysis at strain level

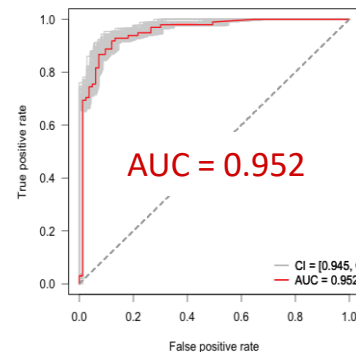


# Diagnostic tool in liver cirrhosis

(Qin N. et al., Nature 2014)



discovery (83+98)



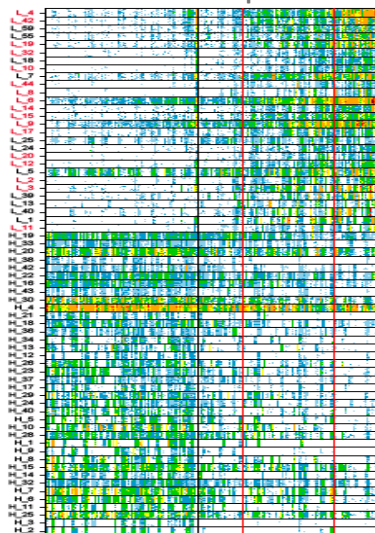
Accurate diagnostics  
irrespective of

- disease origin: alcohol, hepatitis viruses
- disease status: compensated & de-compensated (ascites, encephalopathy...),
- medication: antivirals, beta blockers, proton pump inhibitors or none

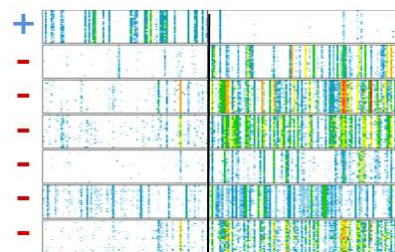
66 marker species

28  
LC  
MGS

38  
Healthy  
MGS

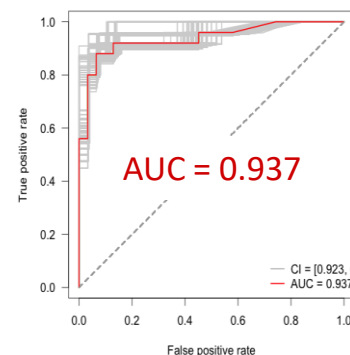


7 model species



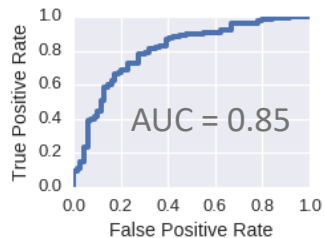
- Additive model
- Genetic algorithm for selection

validation (31+25)

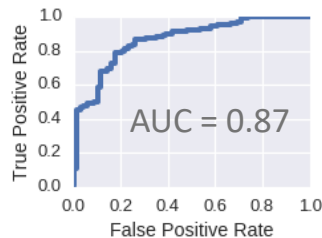


# Microbiota-based obesity prediction modeling

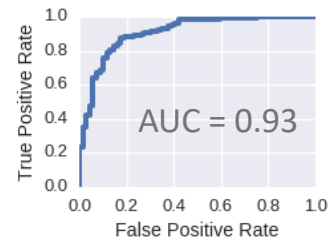
Epidemiological model



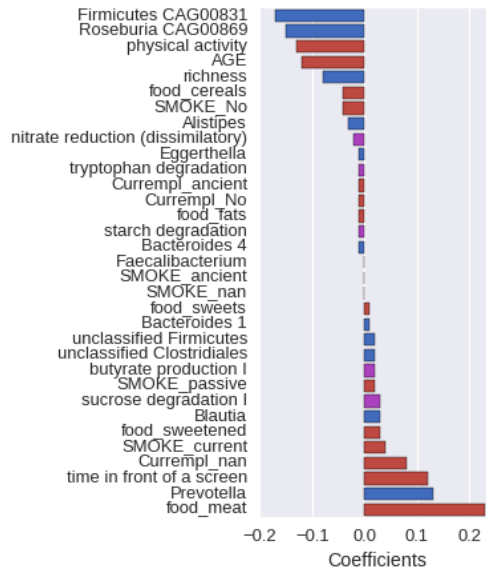
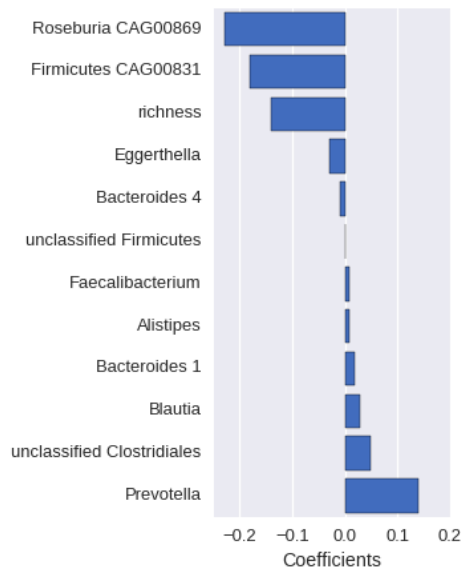
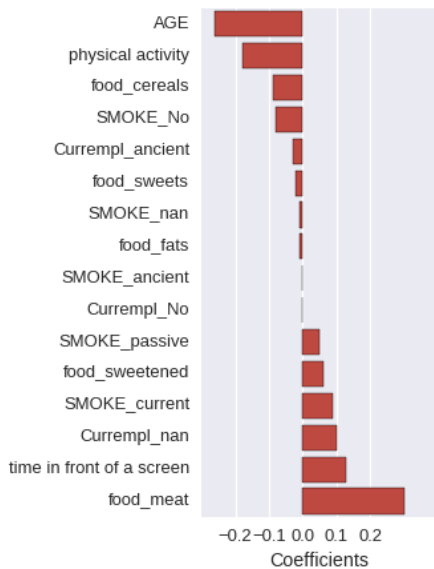
microbiota



microbiota+epidemiology



- LASSO penalized linear regression
- Cross-validation



- Epidemiological variables
- Microbiota variables
- Functional variables

# Future

Expanding microbiome knowledge

- French citizen microbiome science
- Sequence and analyze the gut microbiome of 100,000 French citizen, from newborns to the elderly, and from healthy individuals to individuals with various diseases
- Accelerate the French gut microbiome knowledge and innovation
- Access to high resolution standardized microbiome data
- Access to a network of world-renowned microbiome experts



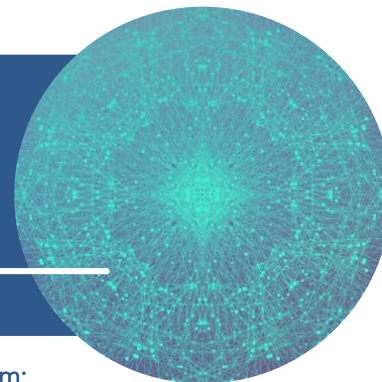


# Million Microbiome of Humans Project (MMHP)

Officially launched the October 26th, 2019 at the 14th International Conference on Genomics (ICG-14)

- Analyze 1 million microbial samples from intestines, mouth, skin, reproductive tract...
- Draw a microbiome map of the human body
- Build the world's largest database of human microbiome
- Solid data foundation for microbiome research
- Explore the potential of the microbiome to help people live better lives

MGP participates to this MMHP in bringing 100 000 french gut metagenomes



## International microbiome research program:

- Karolinska Institute of Sweden
- Shanghai National Clinical Research Center for Metabolic Diseases in China
- University of Copenhagen, Denmark
- Technical University of Denmark
- MetaGenoPolis at the National Institute for Agricultural and Environment Research (INRAE), France
- Latvian Biomedical Research and Study Centre
- Shenzhen BGI Research

# MGP IT platform evolution

On prem and on cloud orchestration  
with ActiveEon-ProActive

# Architecture overview

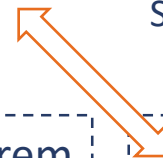
Quantitative Metagenomics Platform  
for gene profiling and statistical analysis



Web Portal and  
Integration with  
Scientific tools



Pre, Post Processing of Data Analysis  
Flexibility, Speed of Analysis  
Granular execution  
Distribution for fast execution  
Secure data transfer



1TB / Sequence  
Analysis

On-Prem



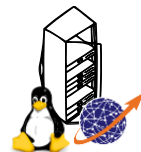
Total  
DNA



QC/Library preparation  
Proton/Illumina  
Sequencing



3.3PB  
DataBase

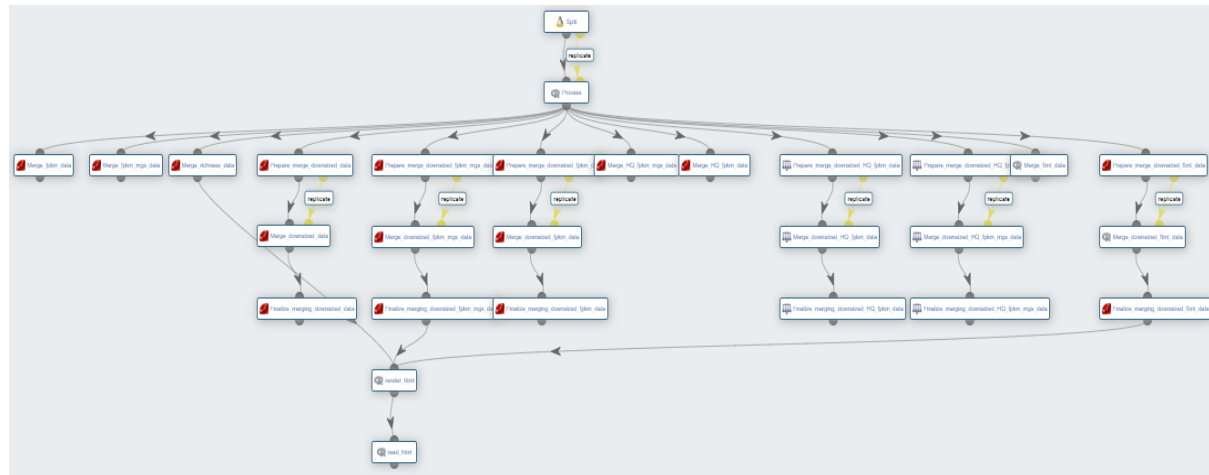


Linux  
Cluster 2  
500 cores



Microsoft Azure

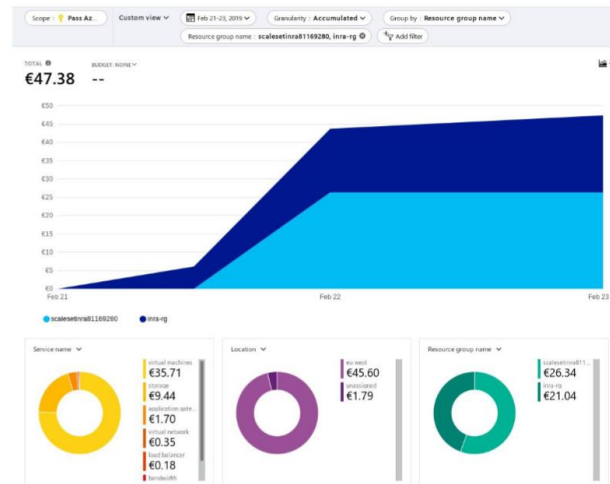
CPU cores on demand  
Cloud Bursting



# Cloud Bursting : PoC In The Box MS-Azure



Dynamic and elastic resource pool



Cost control

## Résultats

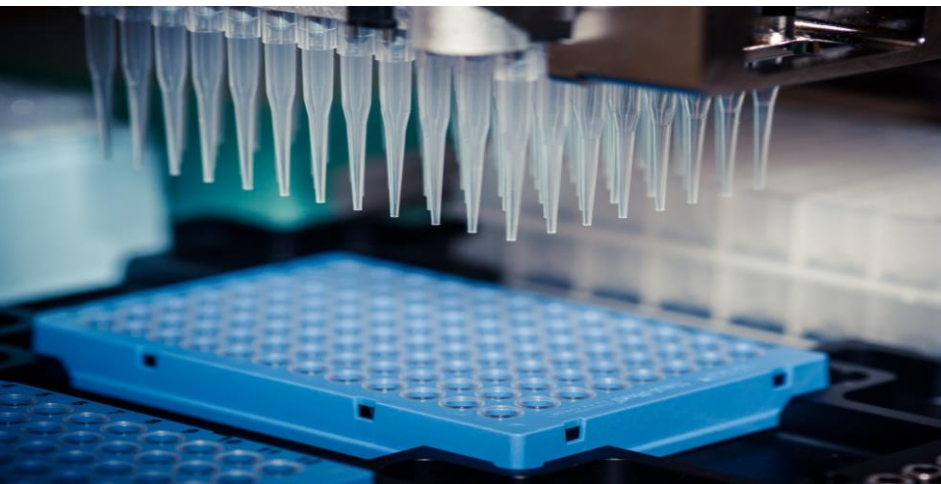
- **Extension de capacité interne**
- Possibilité d'aller sur le cloud dans le cadre d'un **PRA** (plan de reprise d'activité)
- **Agilité du processus d'innovation:** itérations plus rapides, accès à une grande diversité de machines, machines récentes (GPU, CPU, ...)
- **Définition des coûts** (calcul, stockage, ...)

## Opportunités

- Facilité le **débordement** sur le cloud en respectant les normes sécurité
- **Collaboration: mise à disposition d'une plateforme d'analyse du microbiote** à destination de cliniciens et industriels
- **Développement d'une offre machine learning** avec de nouvelles ressources de calcul disponibles à la demande



## Next challenges



- » What is a healthy, a normal microbiome ?
- » Next Generation Big Data analytics
- » Bringing Deep Learning algorithm in microbiome
- » Integrating ethics for AI algorithm explanation
- » Integrating ethics for data collecting, curation, sharing and dissemination
- » Data regulation : GDPR, HDS (vs Cloud Act)  
Exploring European provider (OVHCloud)

# Thanks

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