

# tinyML<sup>®</sup> Talks

*Enabling Ultra-low Power Machine Learning at the Edge*

## “Biosensing at the edge of the Cloud”

Martin Peacock – Director and CSO, Zimmer and Peacock

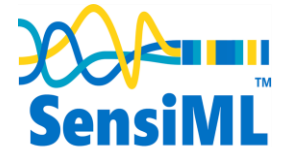
August 22, 2023



[www.tinyML.org](http://www.tinyML.org)



Thank you, **tinyML Strategic Partners**,  
for committing to take tinyML to the next Level, together



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# Executive Strategic Partners

**Qualcomm**  
AI research

# Advancing AI research to make efficient AI ubiquitous

## Power efficiency

Model design, compression, quantization, algorithms, efficient hardware, software tool

## Personalization

Continuous learning, contextual, always-on, privacy-preserved, distributed learning

## Efficient learning

Robust learning through minimal data, unsupervised learning, on-device learning

## A platform to scale AI across the industry



### Perception

Object detection, speech recognition, contextual fusion



### Reasoning

Scene understanding, language understanding, behavior prediction



### Action

Reinforcement learning for decision making



Edge cloud



Cloud



IoT/IIoT



Automotive



Mobile



Accelerate Your Edge Compute

**SYNTIANT**

Making Edge AI A Reality

[www.syntiant.com](http://www.syntiant.com)

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# Platinum Strategic Partners



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AT THE EDGE AT SCALE**

**SONY**

# Gold Strategic Partners





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AHEAD OF WHAT'S POSSIBLE™

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Build the  
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on **arm**



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**EDGE IMPULSE**

# The Leading Development Platform for Edge ML

[edgeimpulse.com](https://edgeimpulse.com)

Decarbonization

Digitalization



Driving decarbonization and digitalization. Together.

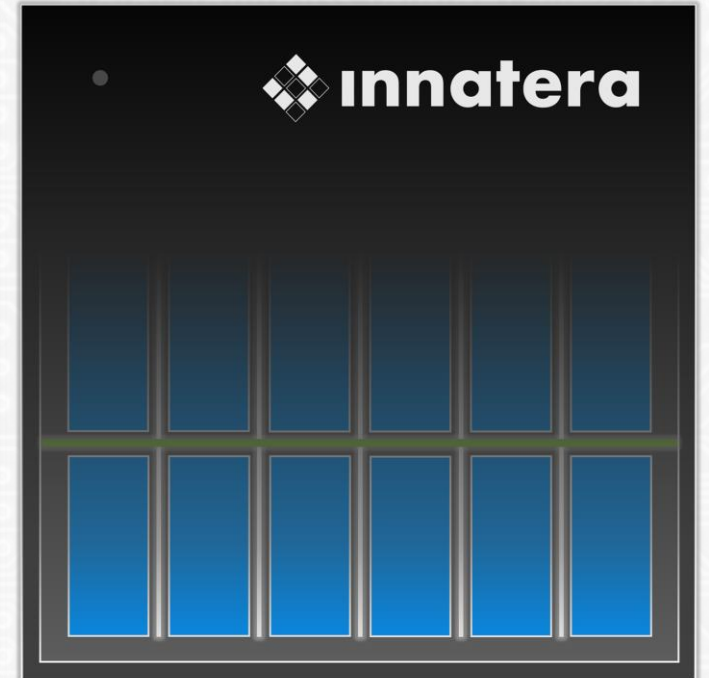
**Infineon serving all target markets as**  
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# NEUROMORPHIC INTELLIGENCE FOR THE SENSOR-EDGE

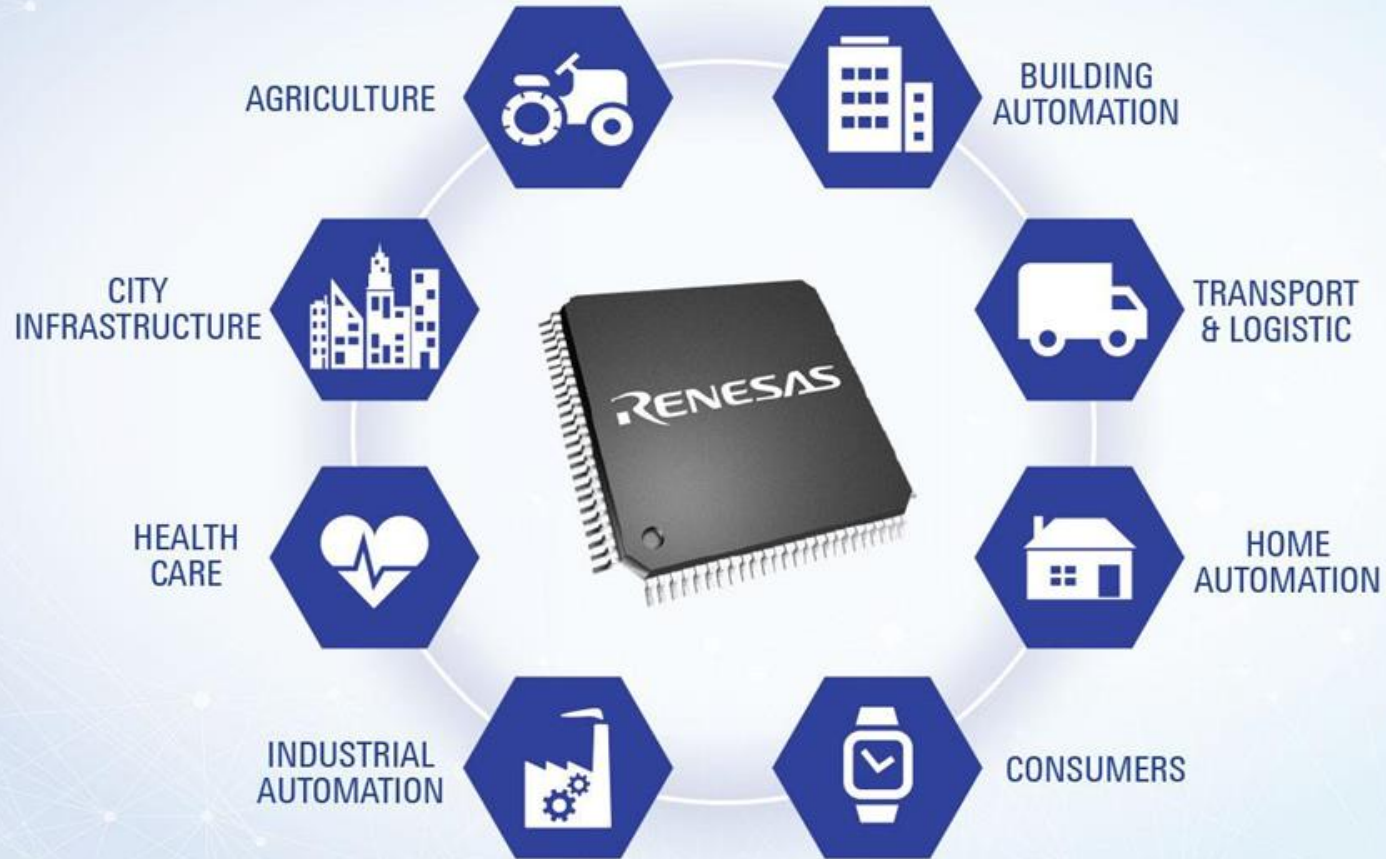


[www.innatera.com](http://www.innatera.com)



Microsoft

**Renesas is enabling the next generation of AI-powered solutions that will revolutionize every industry sector.**



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life.augmented

**STMicroelectronics provides extensive solutions to make tiny Machine Learning easy**





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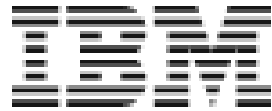
brainchip



GREENWAVES  
TECHNOLOGIES



Grovety Inc.



NotaAI





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16.2k members in  
49 Groups in 41 Countries

**tinyML - Enabling ultra-low Power ML at the Edge**

<https://www.meetup.com/tinyML-Enabling-ultra-low-Power-ML-at-the-Edge/>



4k members  
&  
12.7k followers

**The tinyML Community**

<https://www.linkedin.com/groups/13694488/>





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**10.2k subscribers, 623 videos with 368k views**

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# tinyML Asia Technical Forum

**November 16, 2023**  
**Seoul, South Korea**



**Call for Presentations and Posters – Deadline August 7**  
**<https://www.tinyml.org/event/asia-2023/>**

# 2023 Edge AI Technology Report

The guide to understanding the state of the art in hardware & software in Edge AI.



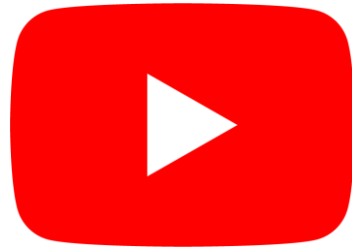


# Reminders

Slides & Videos will be posted tomorrow



[tinyml.org/forums](https://tinyml.org/forums)



[youtube.com/tinyml](https://youtube.com/tinyml)



Please use the Q&A window for your questions





## Martin Peacock



Dr Martin Peacock is an industrial bioelectrochemist with over twenty years of biosensor experience, having had industrial roles from Abbott Diabetes to GSK, and solving technical challenges from continuous glucose monitoring to RNA analysis. In recent years Martin has set-up biosensor focused companies across the globe from Silicon Valley California to Oslo Norway.





# Today

## ABSTRACT

One of the last frontiers of the Internet-of-Things and TinyML is collecting and interpreting chemical, biochemical and biological data. There are multitudes of solutions for knowing the condition of a system through the capture of temperature, humidity, position, images etc, but knowing the chemical and biological condition of a system is still the most unexplored domain.

In this talk ZP discusses biosensors for a smart bio-edge including sensors for: viruses, nitrate, purines, oxidative status, capsaicin, and purines; applications covered in this talk includes Clean Water, Food Quality and Health.



# Call to action

All the easy stuff is done, time for biology

# Today

- Quick introduction to ZP and myself
- Why does ZP exist
  - IoT, TinyML and the technology/application gaps
- Wearables – Embedded and Transdermal
- IVD (Lab on a chip, Rapid Diagnostic Testing, PoCD, Spot testing)
- Applications:
  - Food Quality , Clean Water and Health



# Quick resume

Scan to connect  
with me on  
LinkedIn



- ▶ **Martin Peacock**
- ▶ **First degree chemistry**
- ▶ **Second degree electrochemistry**
- ▶ **Industrial roles:**
  - ▶ **GSK – Medicinal Chemist**
  - ▶ **Abbot Diabetes – Electrochemist**
- ▶ **Companies founded in the last 4-years:**
  - ▶ **Zimmer and Peacock Ltd**
  - ▶ **Zimmer and Peacock AS**
  - ▶ **Zimmer and Peacock Inc**
  - ▶ **CeeLab**
  - ▶ **Aliksir**

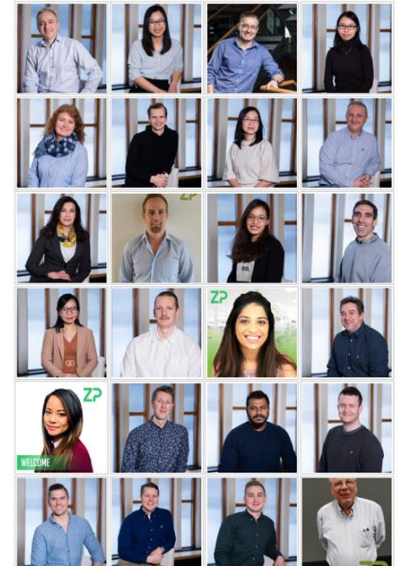


# Brief Introduction to ZP



# ZP - Commercial

- Launched - 2014
- ISO13485 – Development and manufacturing of biosensor and IVDs
- Contract developers and manufacturers of electrochemical biosensors
- Norway and UK



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# ZP Team



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# Norway





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# United Kingdom





# Why are we here?



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# Why ZP?



Machine Vision / Optical Ambient Light



Position / Presence / Proximity



Motion / Velocity / Displacement



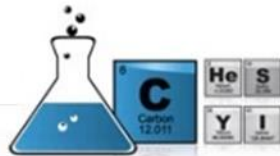
Temperature



Humidity / Moisture



Acoustic / Sound / Vibration



Biological biochemical

# ZP



Flow



Force / Load / Torque Strain / Pressure



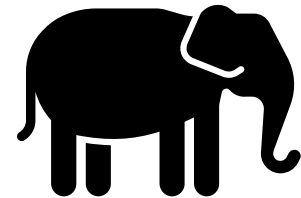
Leaks / Levels



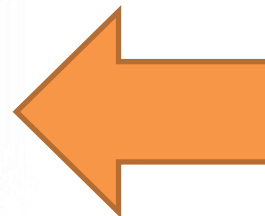
Electric / Magnetic

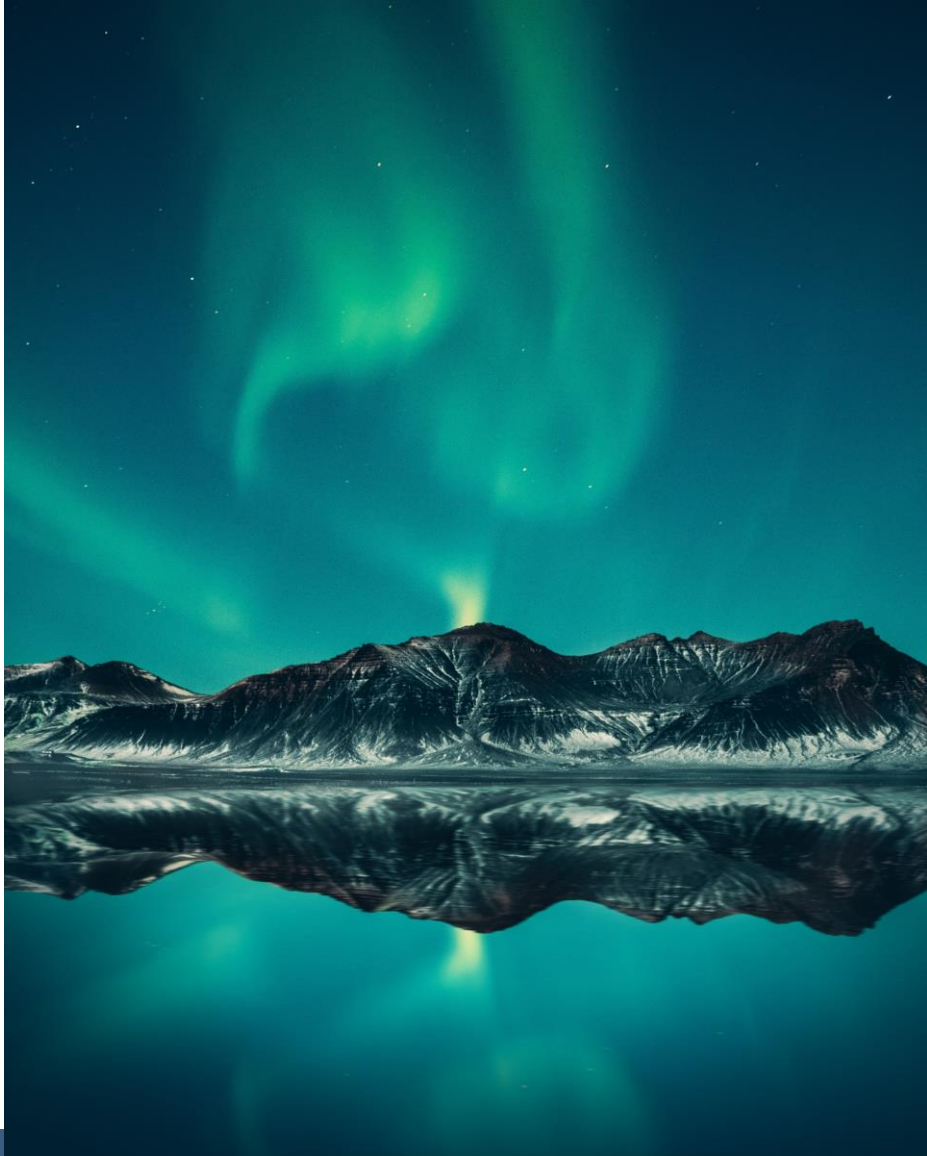


Acceleration / Tilt



**MISSING**





Solid

Liquid

Gas



Sweat

Saliva

Tear film

Urine

Interstitial fluid

Blood

# What makes what we do possible



Low Power



Miniaturization



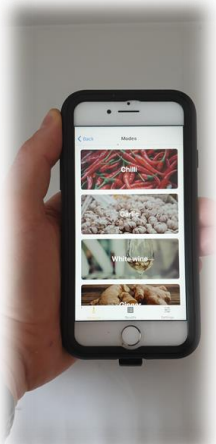
Connectivity



Cloud computing/API



Data Sciences/AI/TinyML



Smart phones



# Trends in biosensing Miniaturization



CLINICAL LAB ANALYSER



TABLE TOP



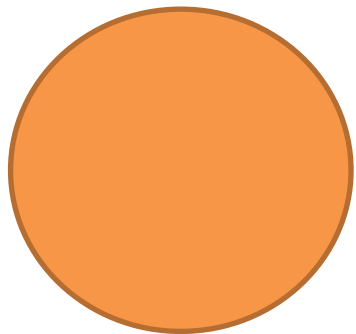
HAND HELD



PALM SIZE



WEARABLE

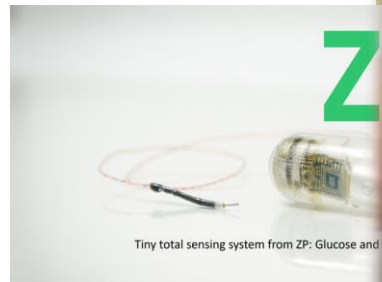
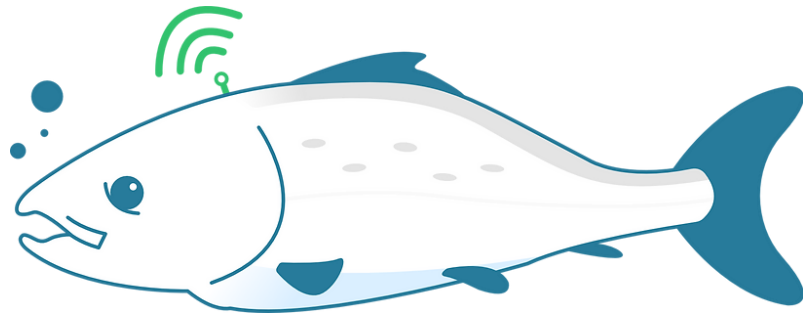




# Applications



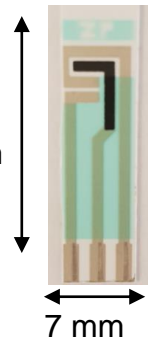
Haematology and analytes in blood





# Electrochemical biosensors

25 mm



<b>Glu</b> Glucose Sensors	<b>O<sub>2</sub></b> Oxygen Sensors	<b>Lac</b> Lactate Sensors	<b>H<sub>2</sub>O<sub>2</sub></b> Hydrogen Peroxide Sensors	<b>pH</b> pH Sensors
<b>Cl<sup>-</sup></b> Chloride Sensors	<b>K<sup>+</sup></b> Potassium Sensors	<b>Ca<sup>2+</sup></b> Calcium Sensors	<b>Alcohol</b> Alcohol Sensors	<b>NO<sub>3</sub><sup>-</sup></b> Nitrate Sensors
<b>NO</b> Nitric Oxide Sensors	<b>NH<sub>4</sub><sup>+</sup></b> Ammonium Sensors	<b>Uric Acid</b> Uric Acid Sensors	<b>Na<sup>+</sup></b> Sodium Sensors	<b>HPO<sub>4</sub><sup>2-</sup></b> Phosphate Sensors
<b>SO<sub>3</sub><sup>2-</sup></b> Sulfite Sensors	<b>ORP TAS FRAP</b> REDOX/ TAS/ FRAP	<b>Ketone</b> Ketone Sensors	<b>S/m</b> Conductivity/Salinity Sensors	<b>NADH</b> NADH Sensors
<b>Purine</b> Purine Sensor	<b>Fructose</b> Fructose Sensors	<b>Cortisol</b> Cortisol Sensor	<b>Skatole</b> Skatole Sensor	<b>Androstenone</b> Androstenone Sensor
<b>Troponin</b> Troponin Sensor	<b>Galactose</b> Galactose Sensor	<b>Glycerol</b> Glycerol Sensor	<b>Malic Acid</b> Malic Acid Sensor	





# Warning

Electrochemical Sensors are often in intimate contact with the sample and contain biological material

For every application there is an accompanying TinyML model

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# Low cost to manufacture and scalable





# Configurations

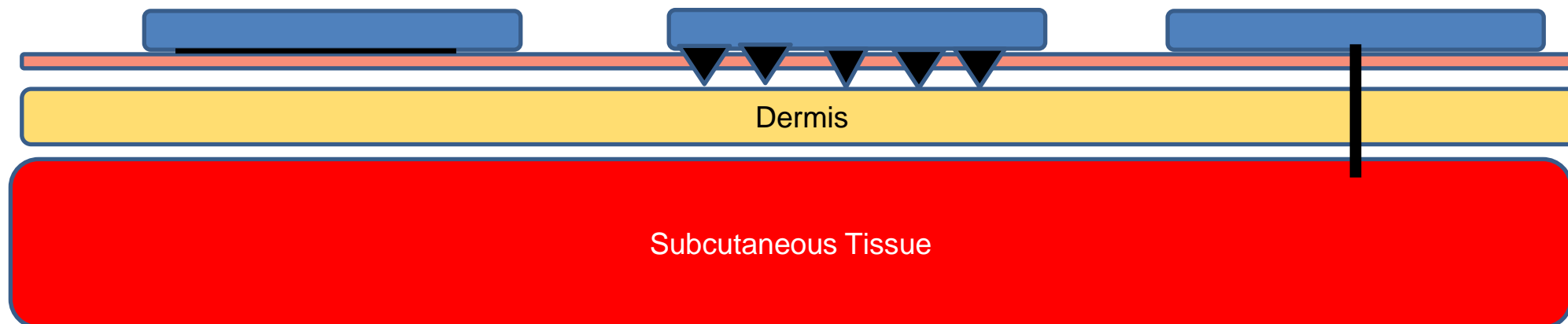


Non-invasive

Microneedles

Wire/filament

Epidermis



Dermis

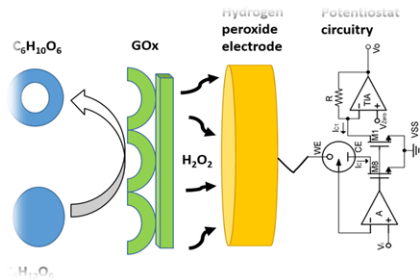
Subcutaneous Tissue



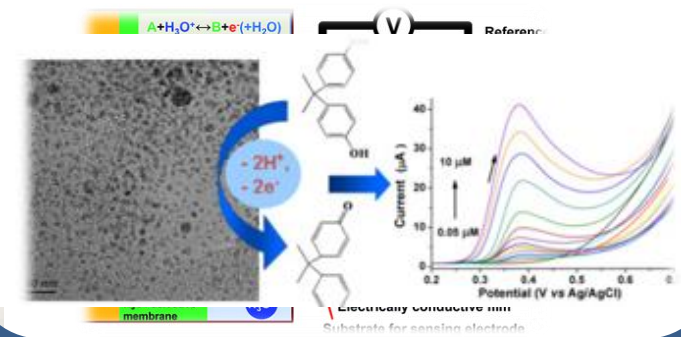
Implanted

# Electroanalytical techniques

## Amperometry



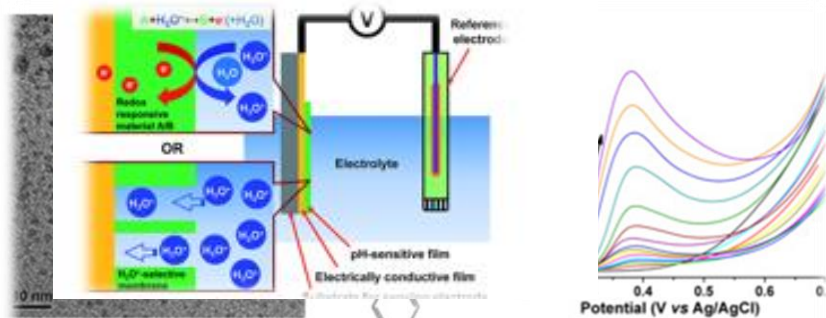
## Voltammetry



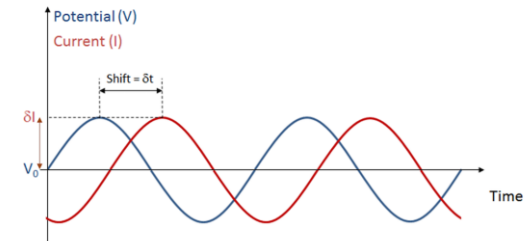
Electronics for biosensors



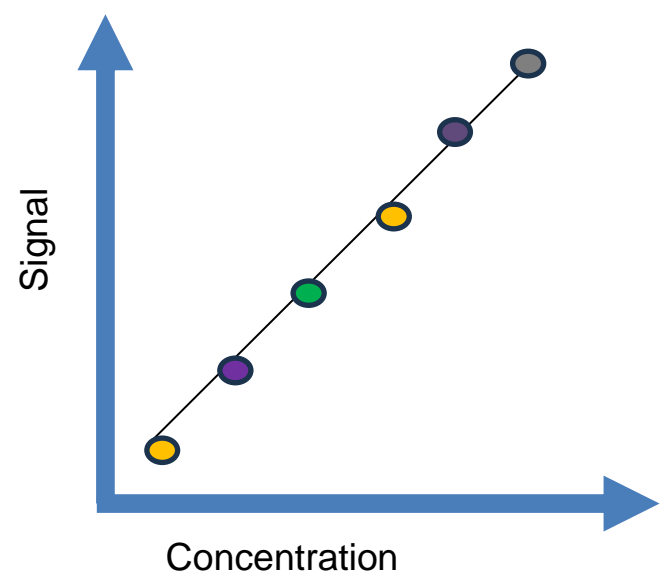
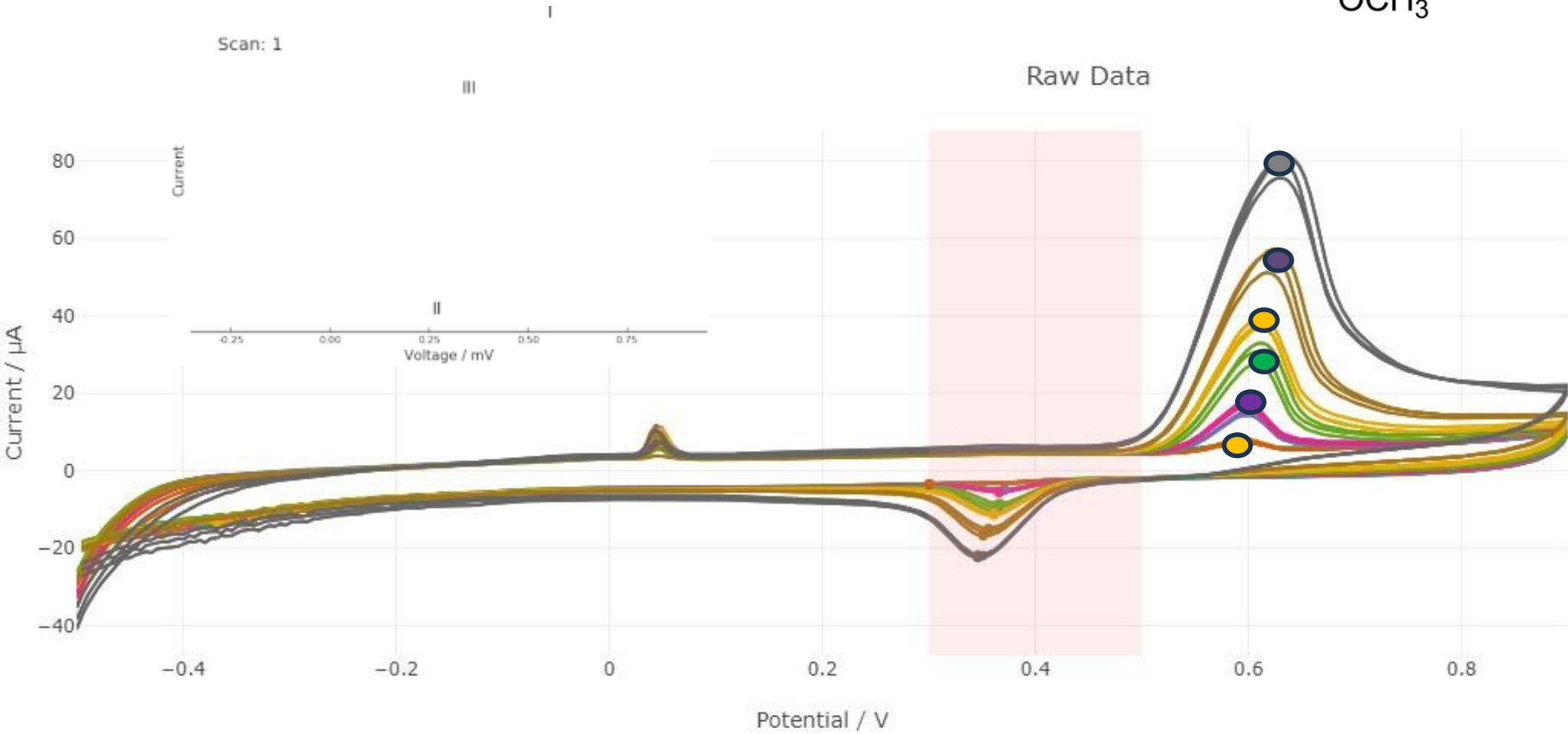
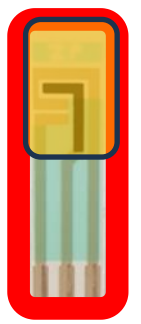
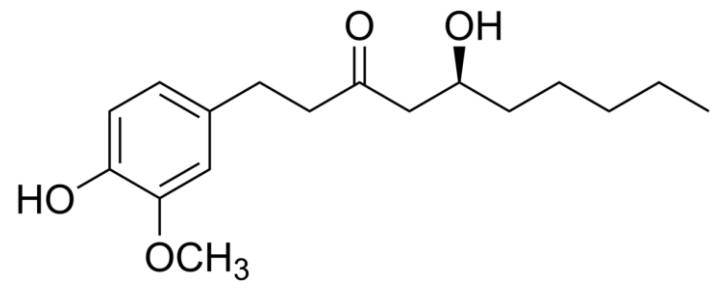
## Potentiometry



## Impedance Spectroscopy



# Voltammetry

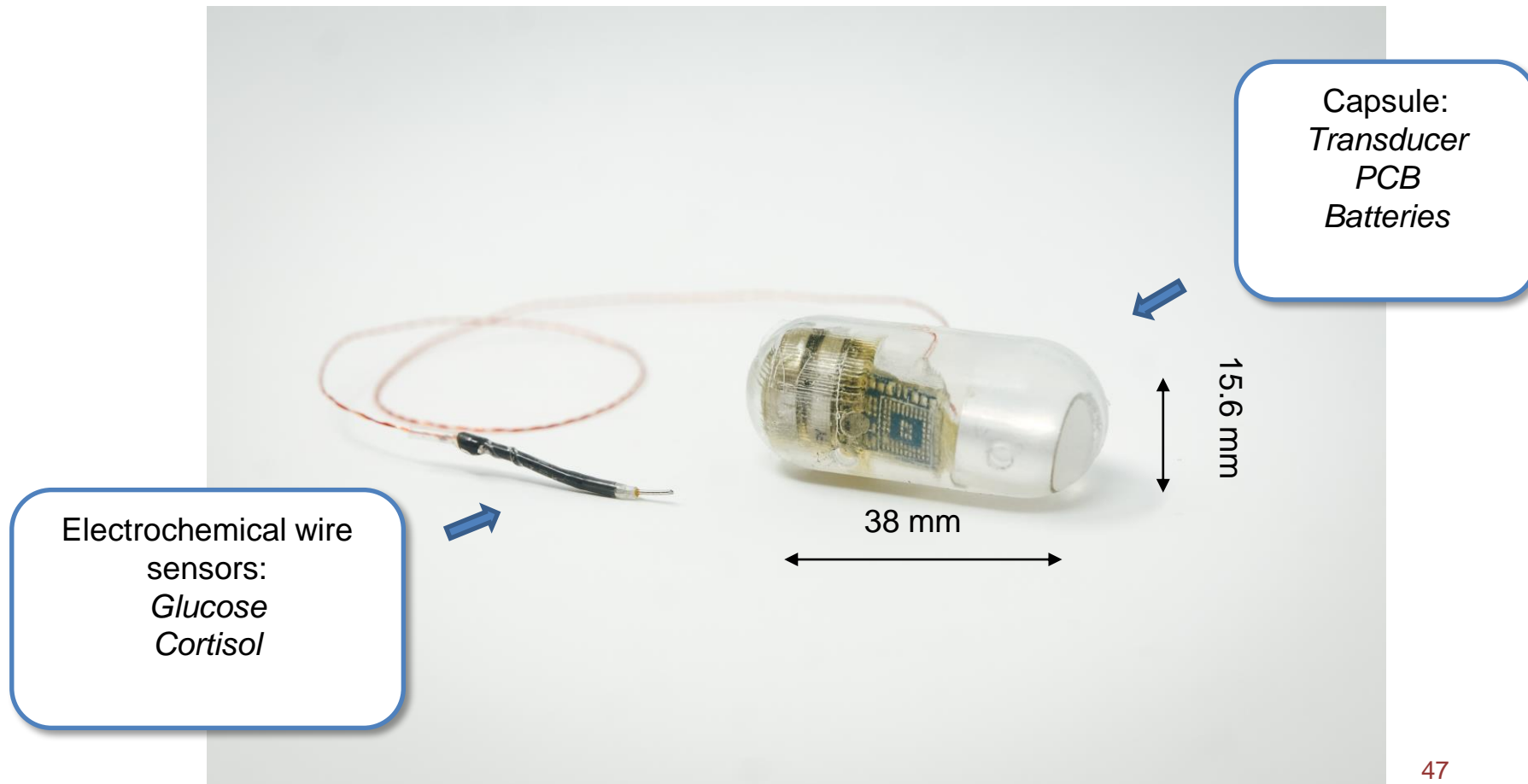




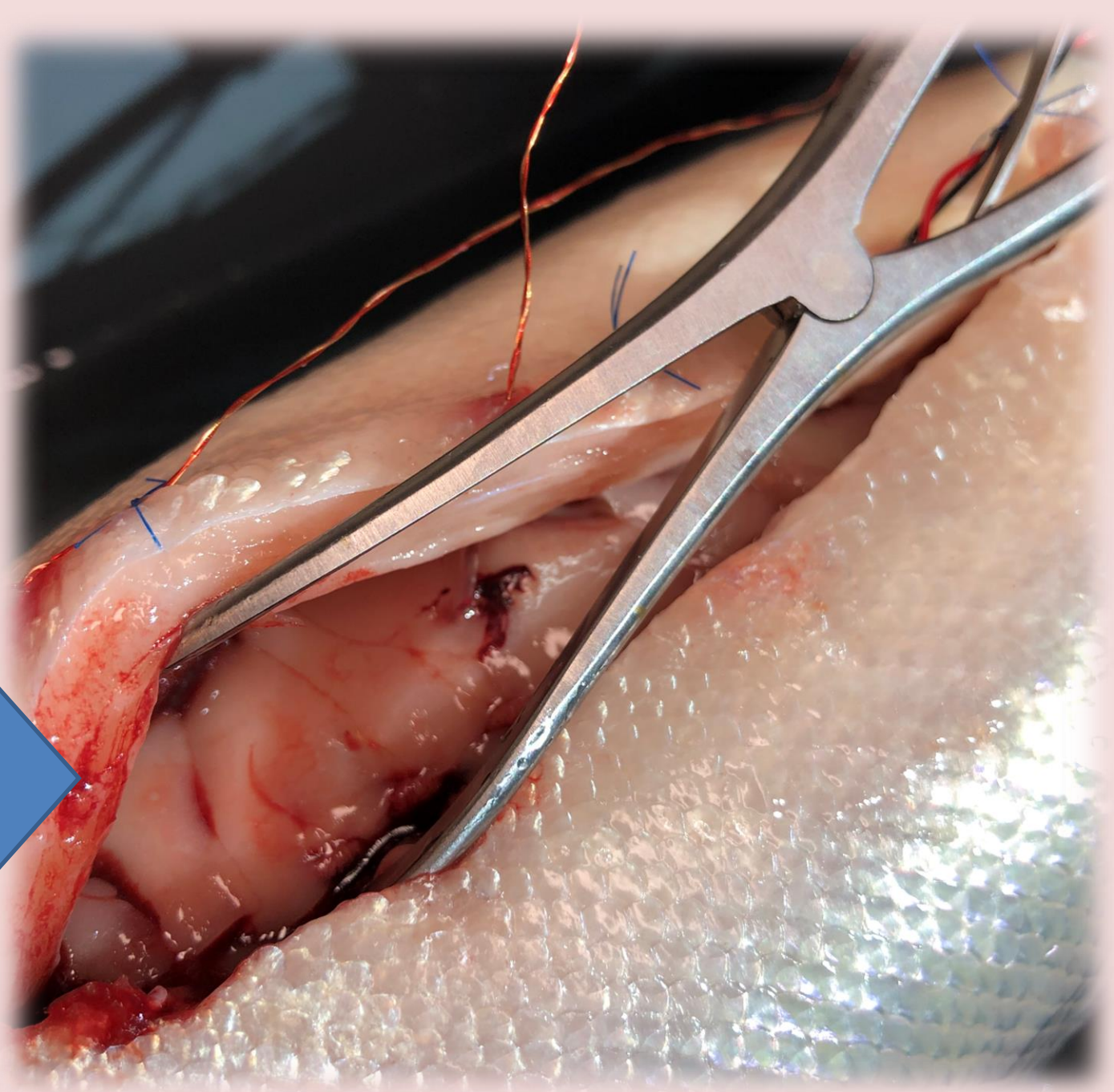
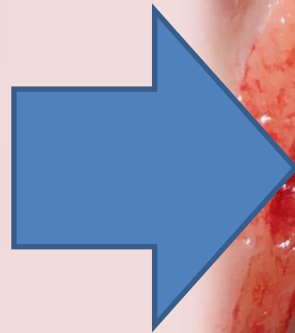
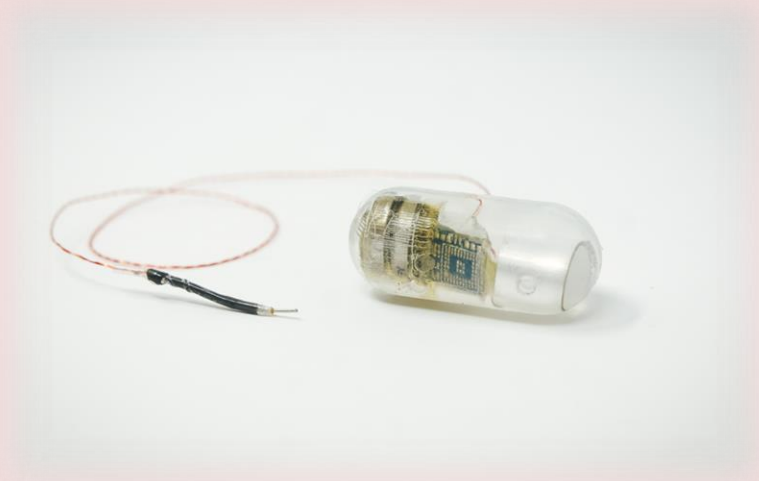
# Continuous Measurements

- In-vivo Embedded
- Ex-vivo Wearable
- In-situ soil

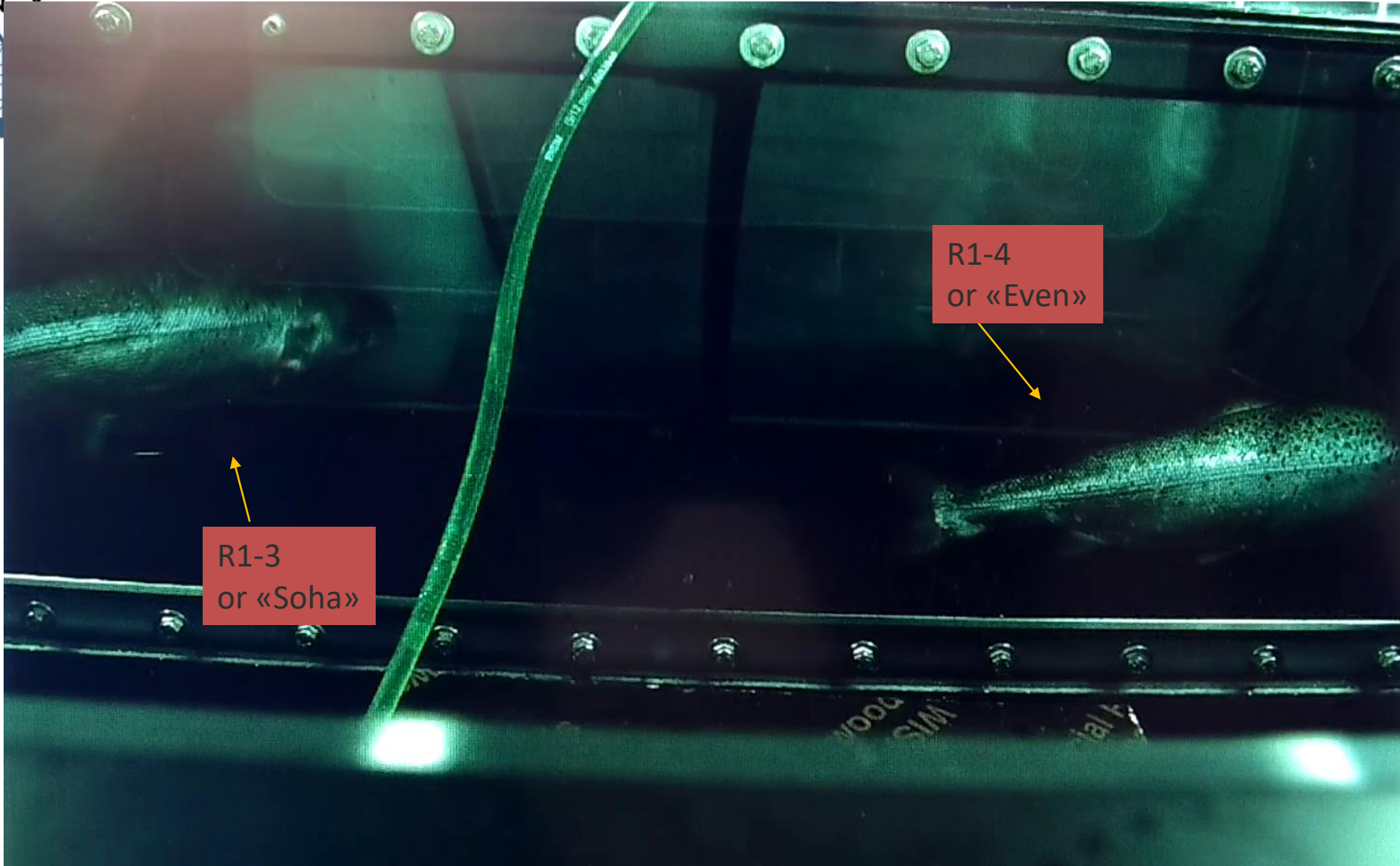
# Telometry unit with sensors



Warning





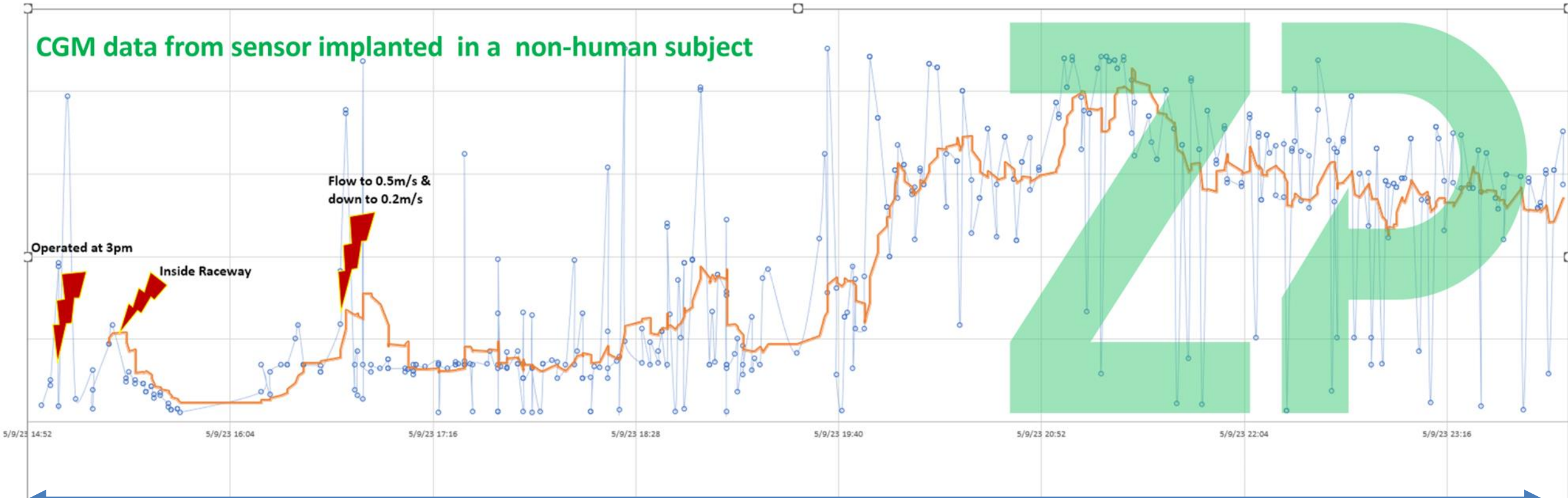




# Implantable tag



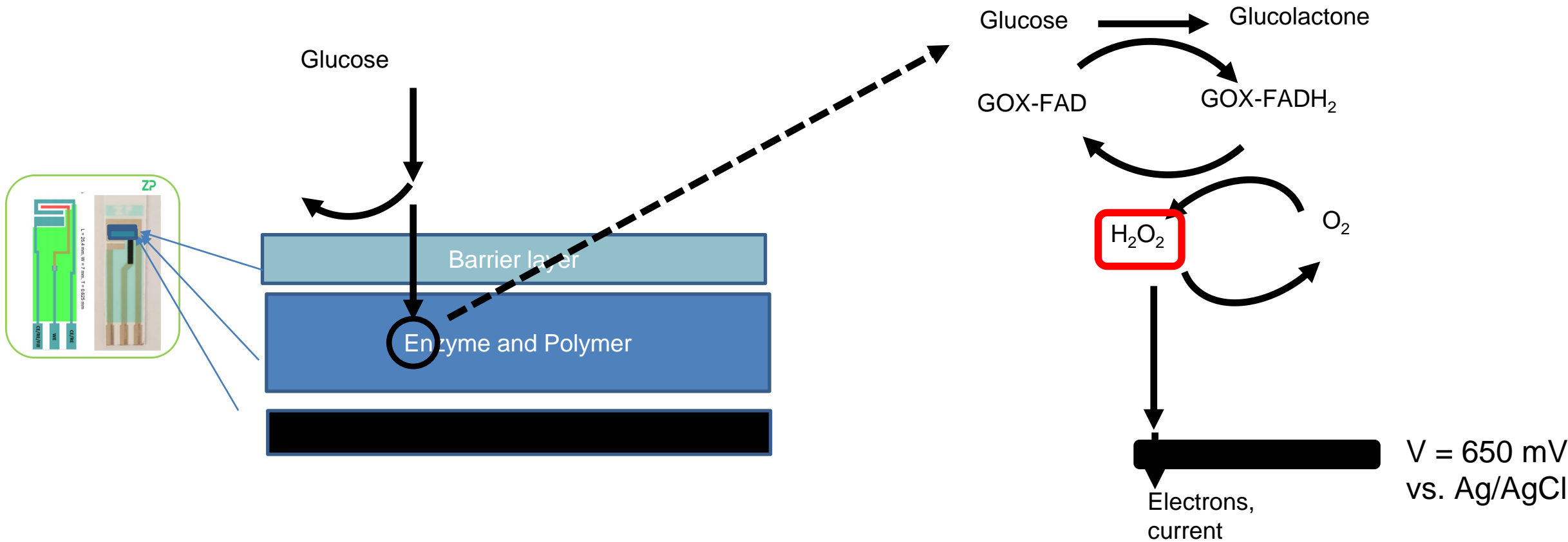
## CGM data from sensor implanted in a non-human subject



9 hours



# Glucose Sensor – Generation One



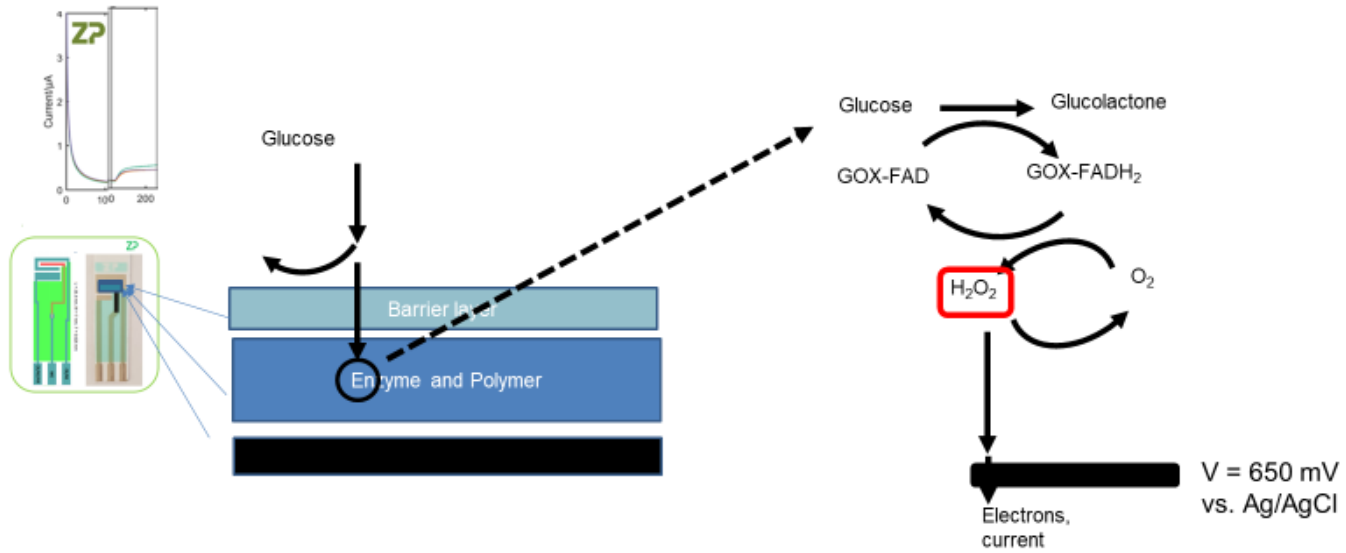


ZP



CGM Smartwatch

# Glucose Sensor – Generation One



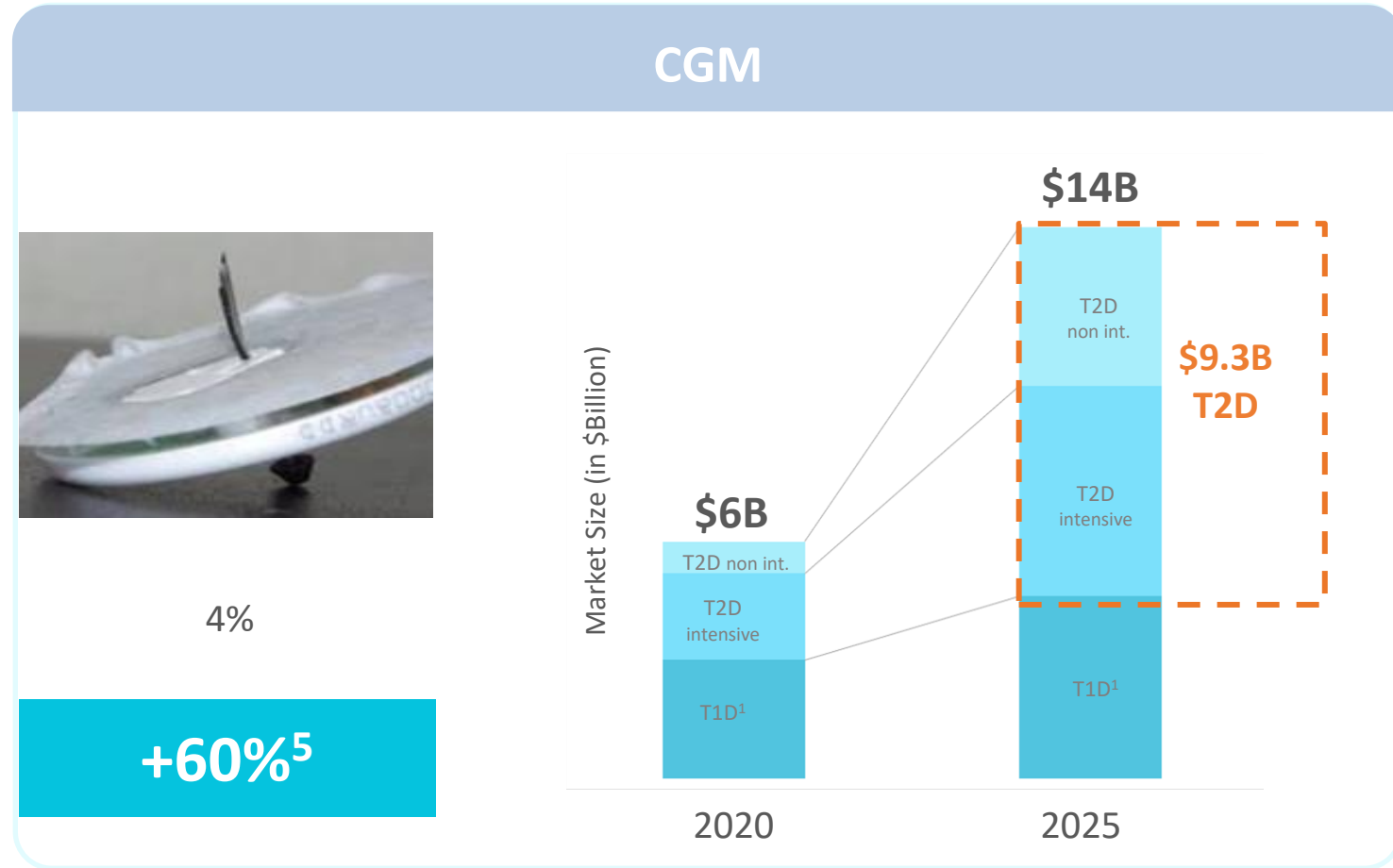
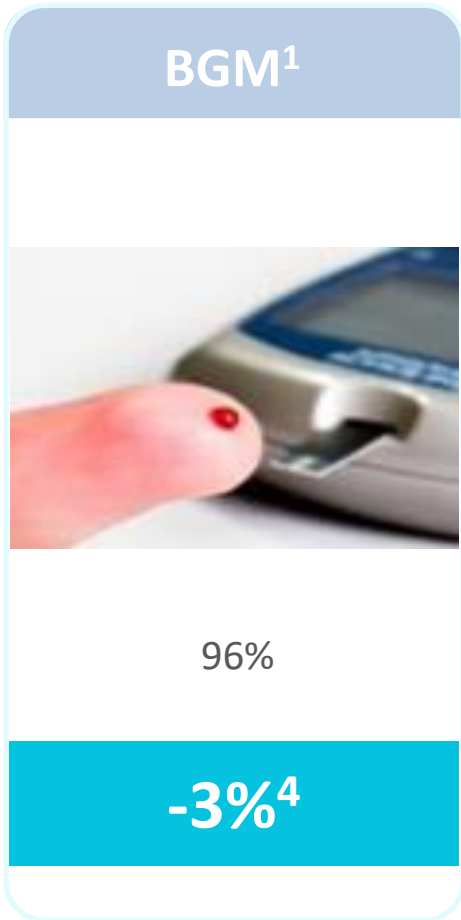
## MEDICAL SMARTWATCH

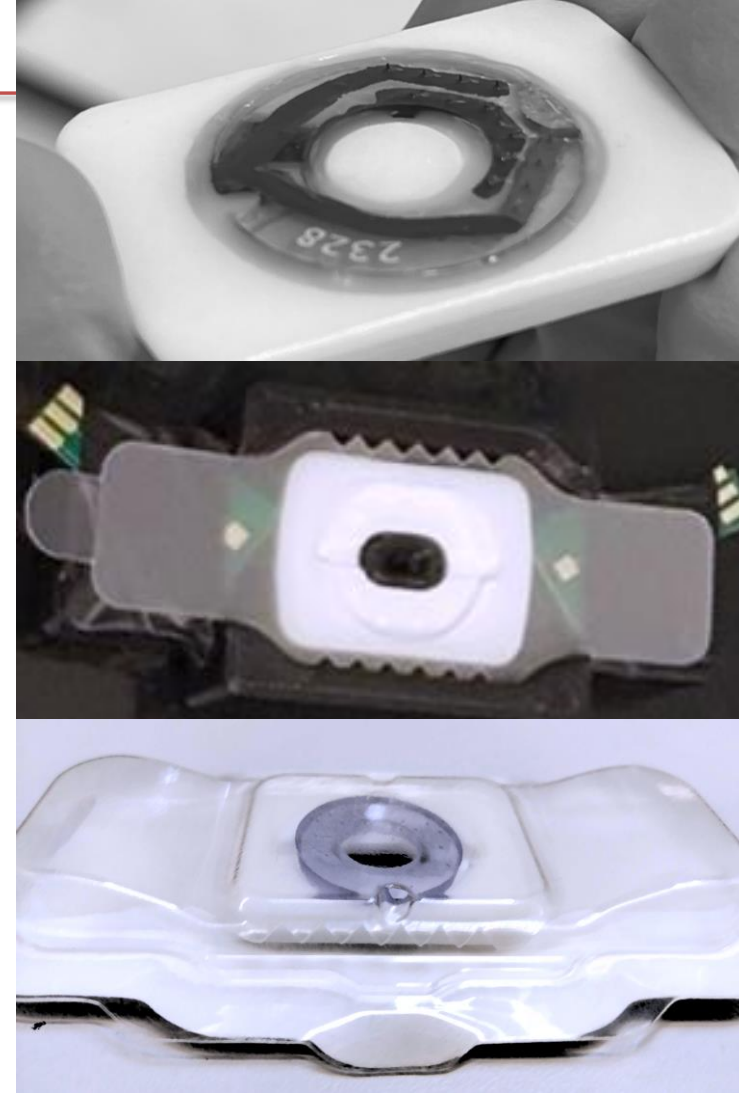


## CONSUMABLE PATCH WITH MICROPOINTS



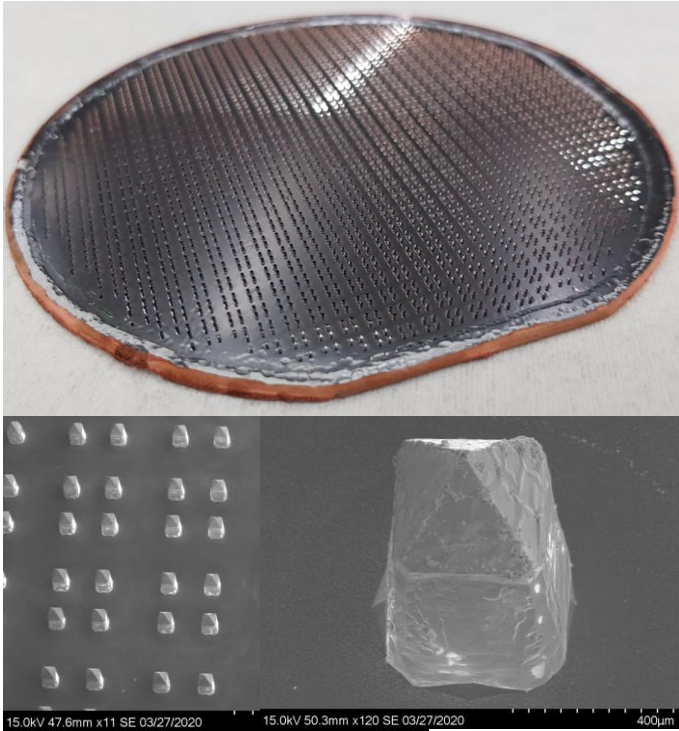
● CGM<sup>1</sup>: A FAST GROWING \$14B<sup>2</sup> MARKET, WHERE T2D<sup>1</sup> IS GROWING



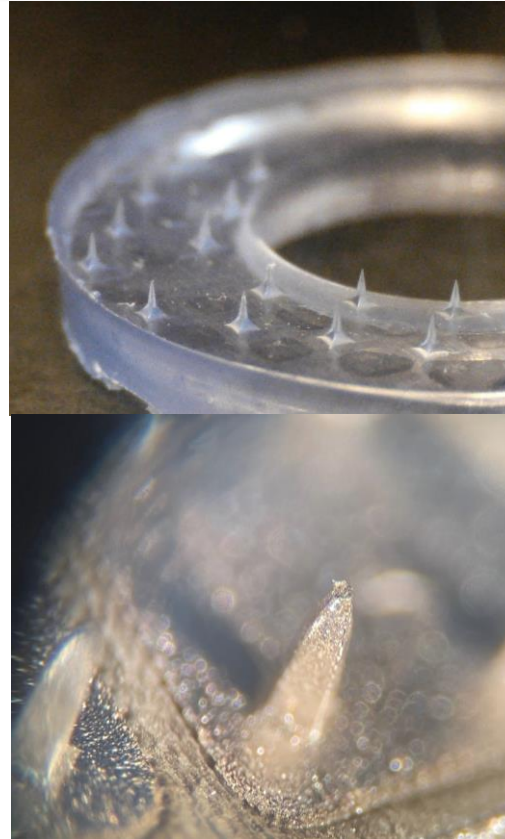




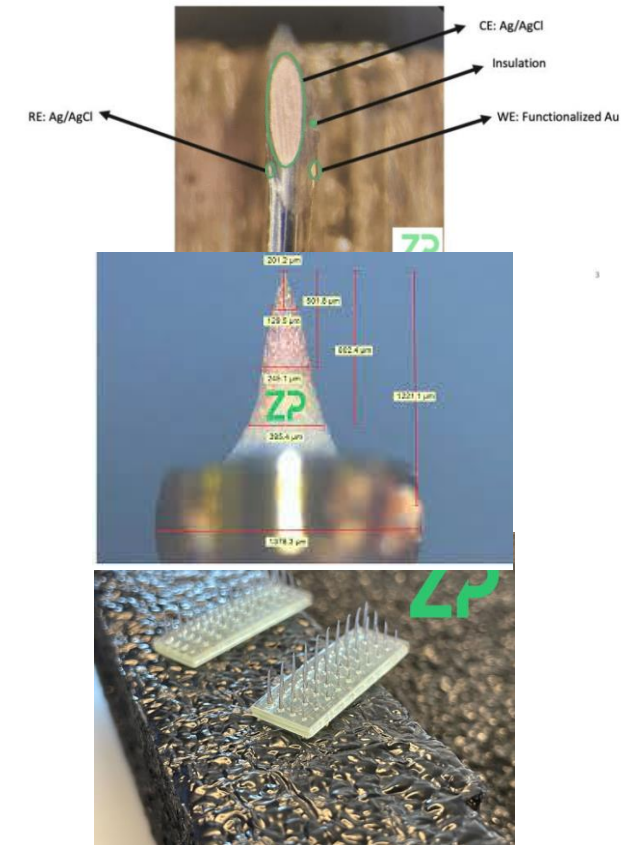
# Microneedle development



MEMs fabrication



Inject molding

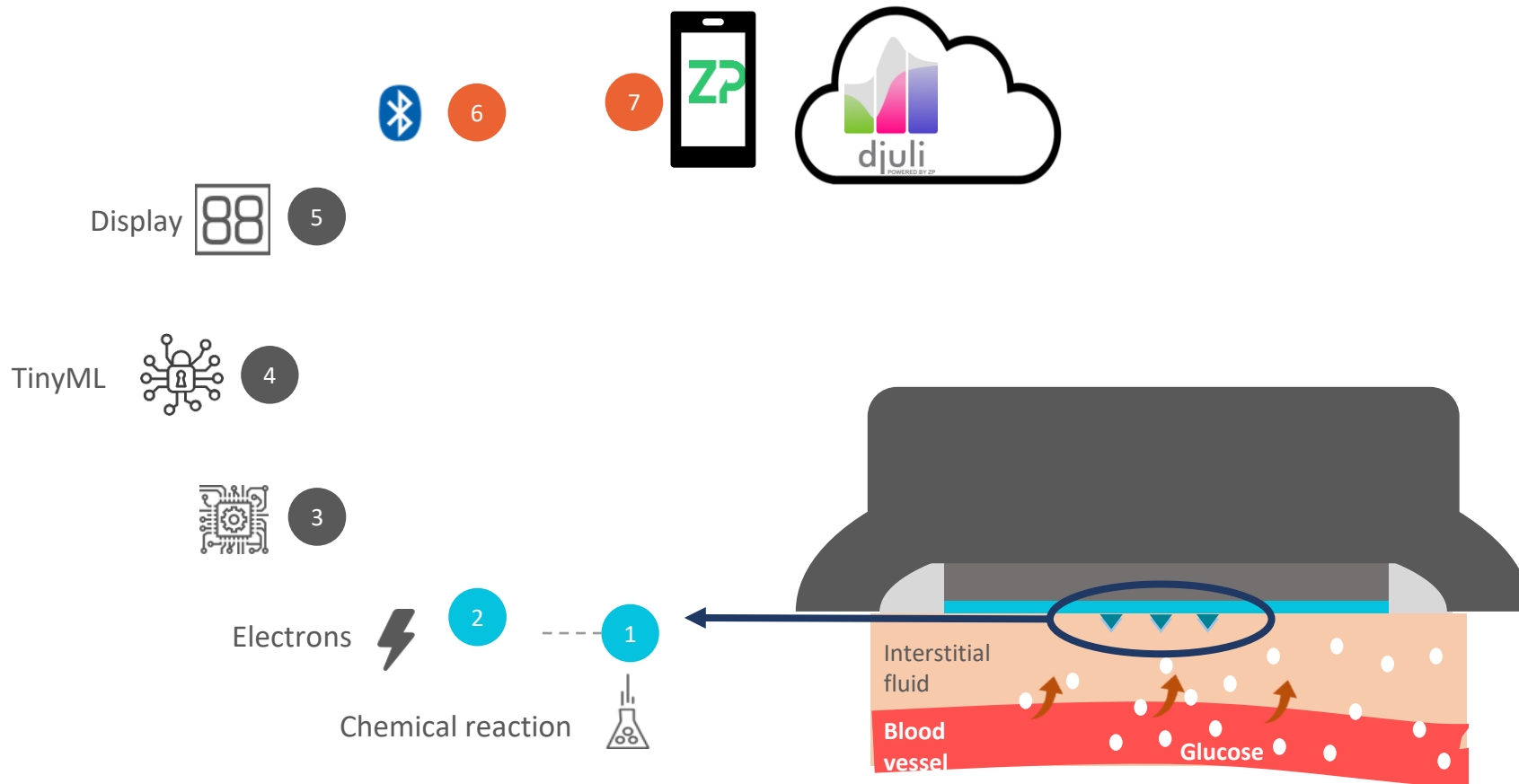


Other sensor fabrications



# • SENSOR: EXCELLENT IRRITATION, IN VITRO AND IN VIVO TESTS





# Architecture Protected by 36 Patents



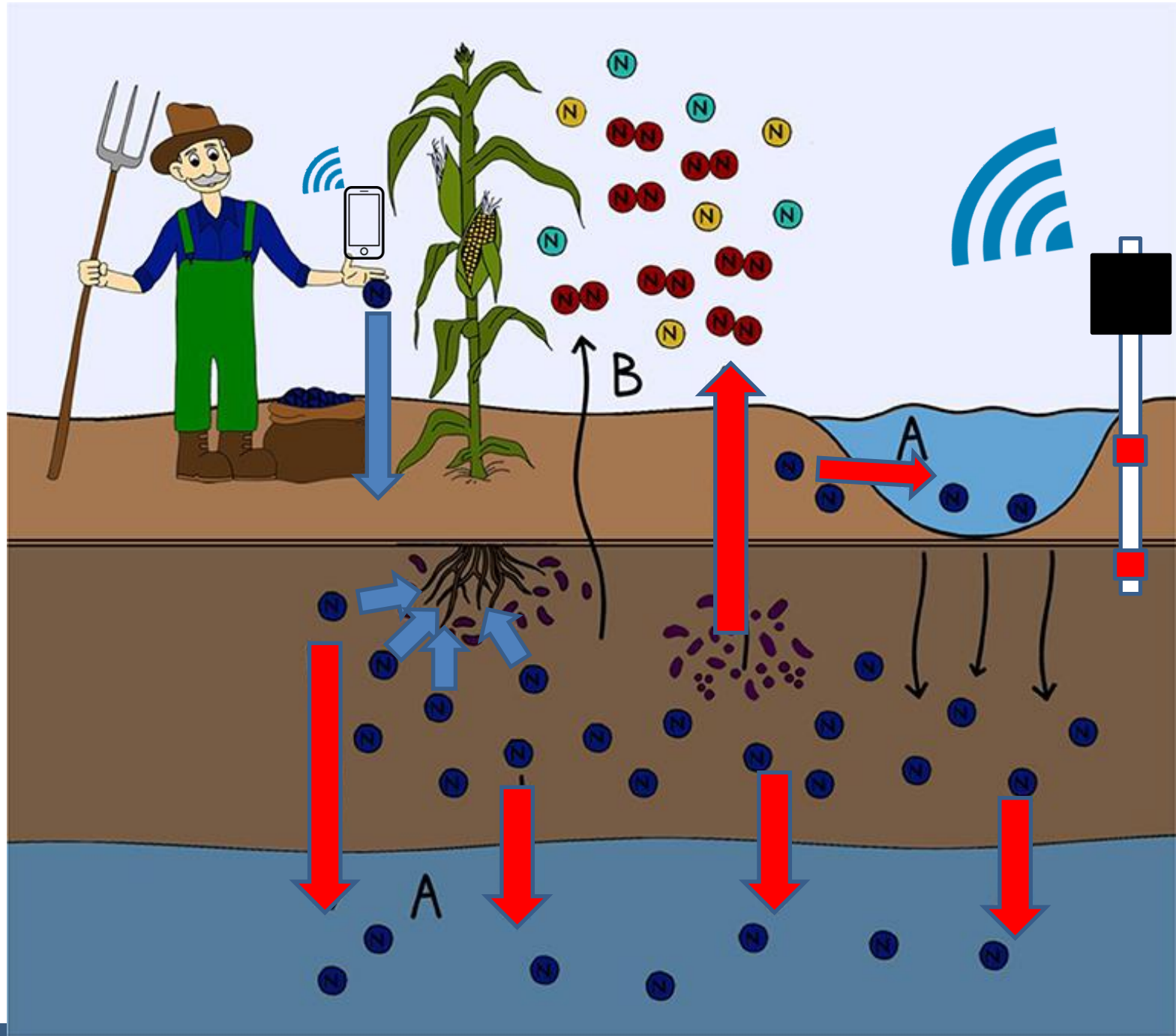
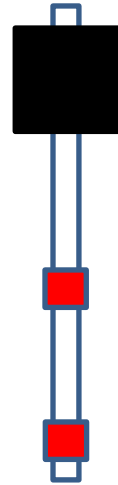
# Some statistics on nitrate

- 1.2 % of global CO<sub>2</sub> production is from nitrate production
- 1.0 % of global energy production goes into nitrate
- 67 % of nitrates are wasted
- Local pollution: blue baby syndrome, eutrophication, acidification of soil



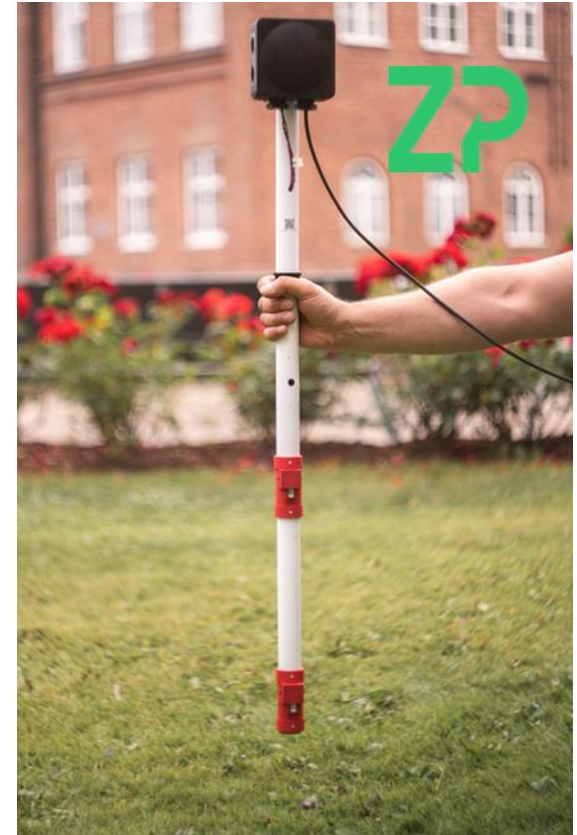
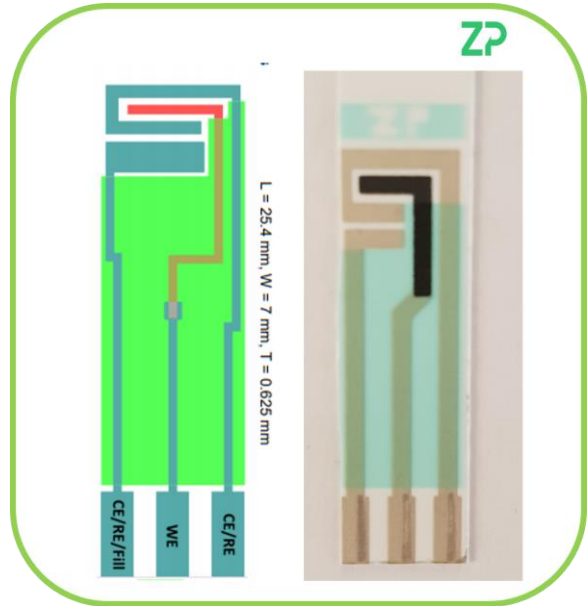
# The Problem

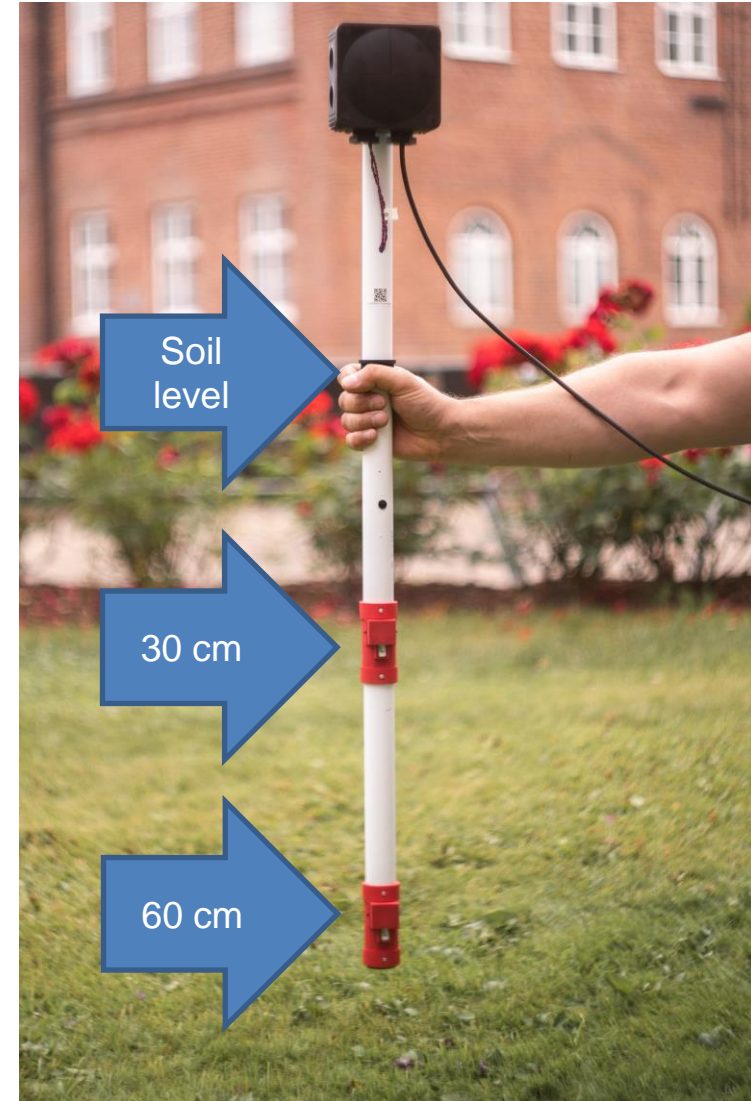
## The solution



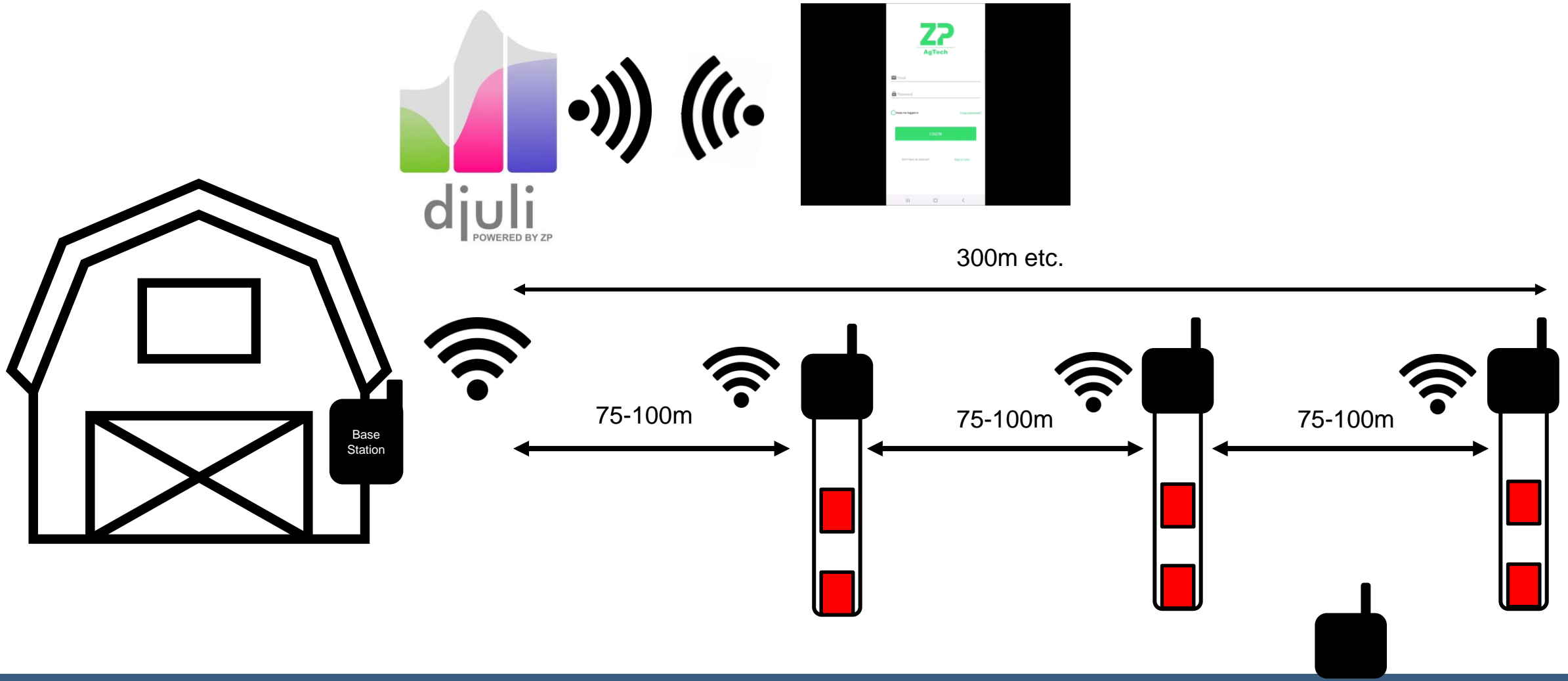


# Progression of the ZP nitrate sensor





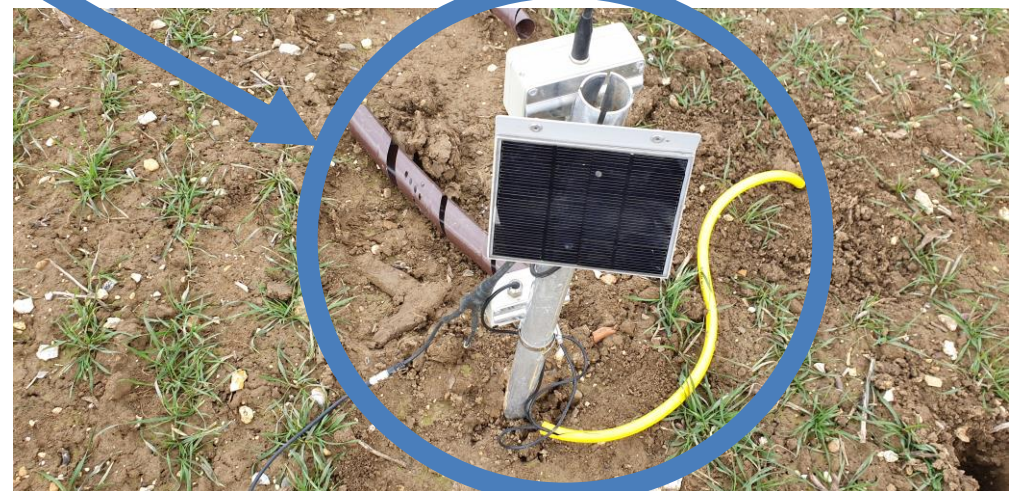
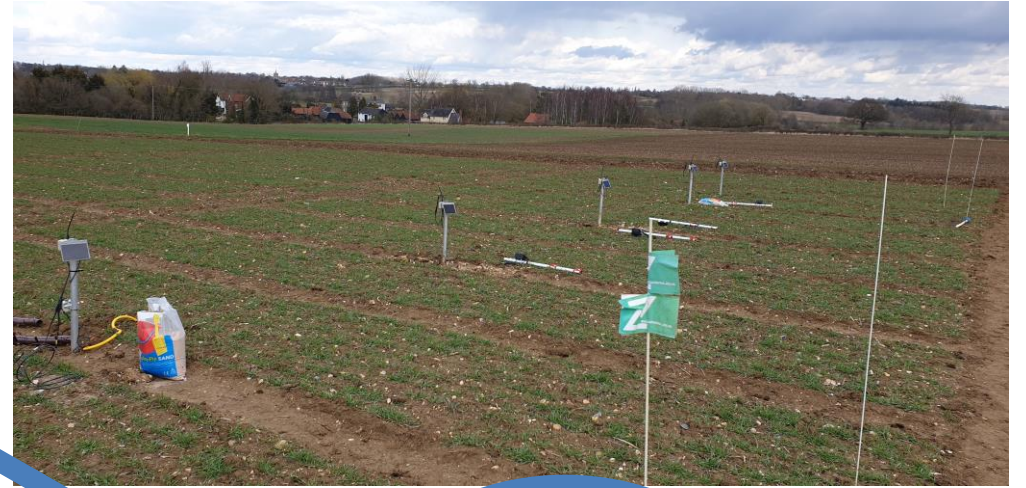
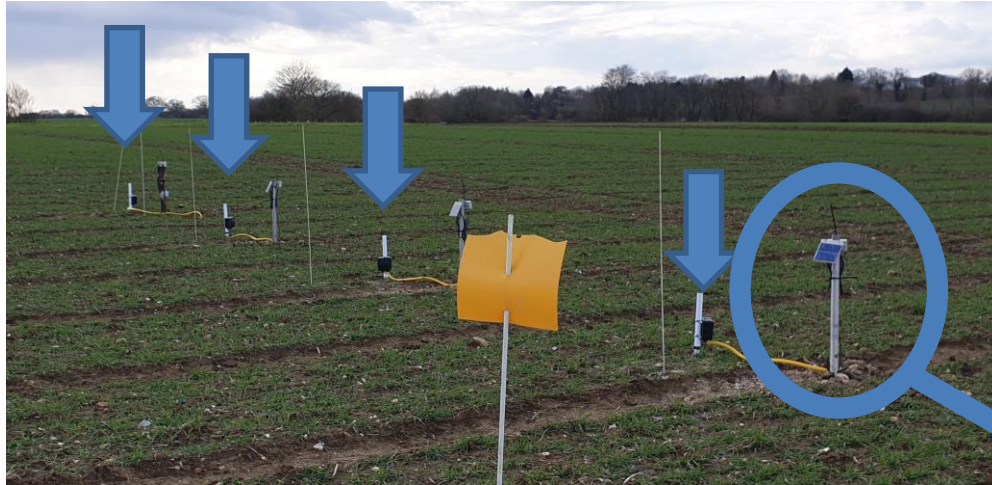
# Soil Nitrate Sensor Mesh Starter Kit – WiFi - LoraWAN





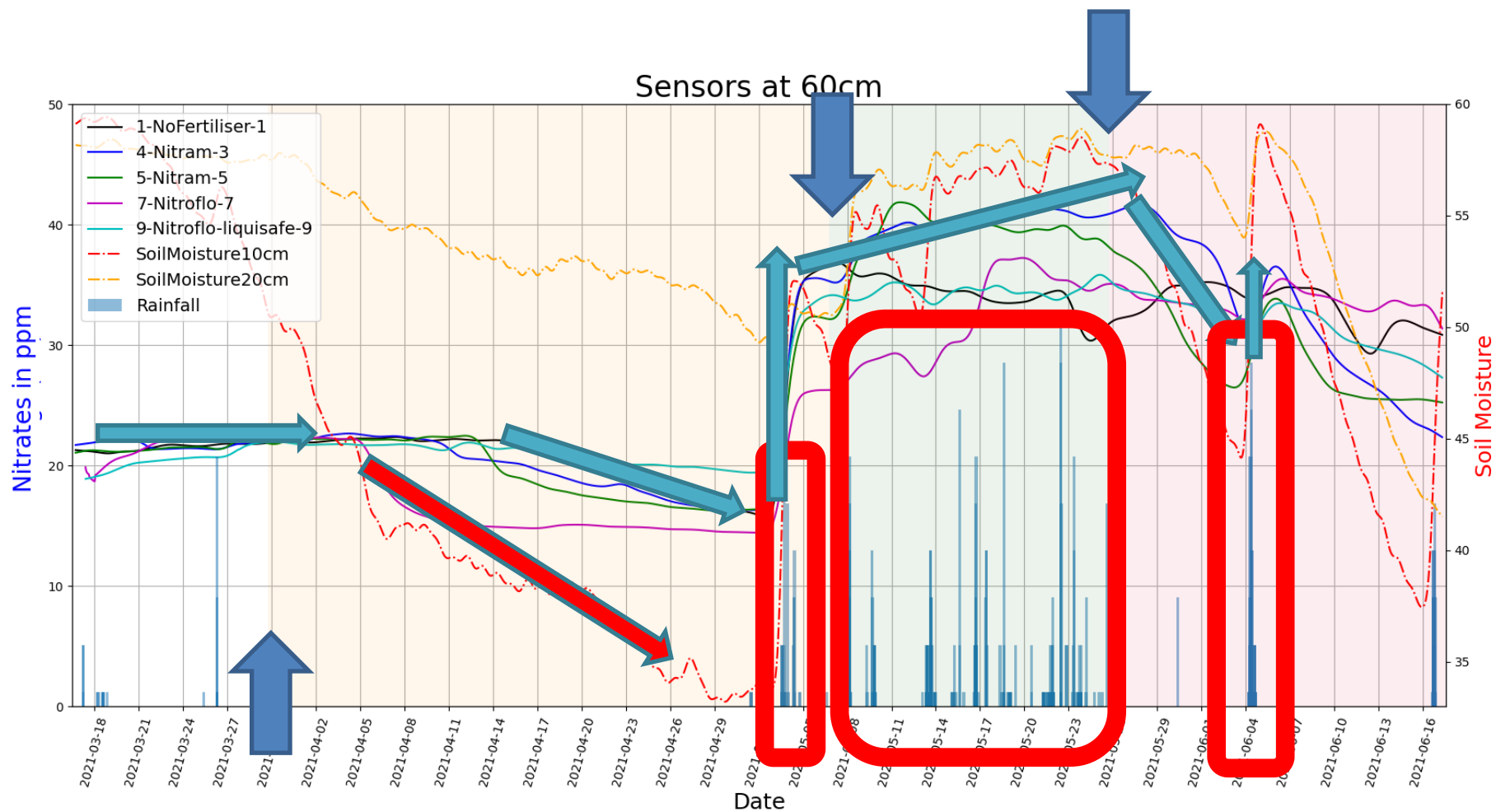


# Field Installation





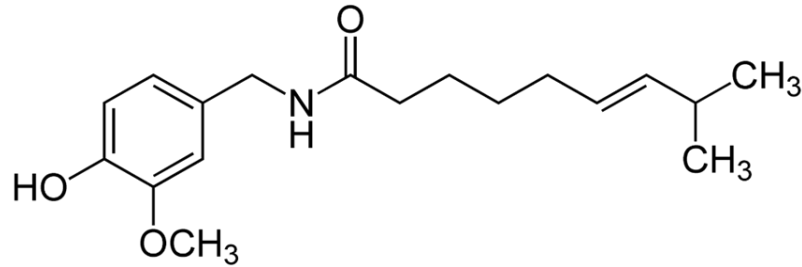
# Data



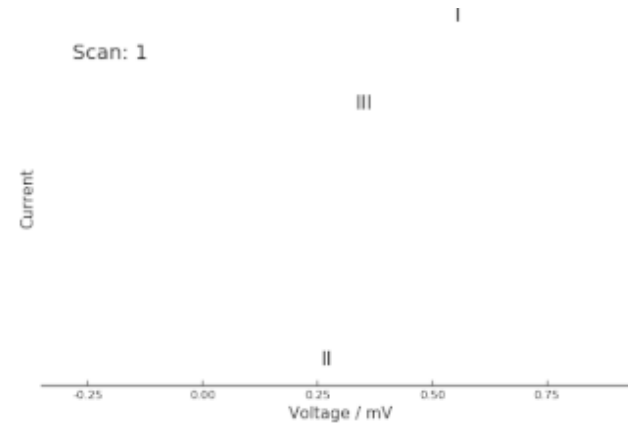


# Case study one

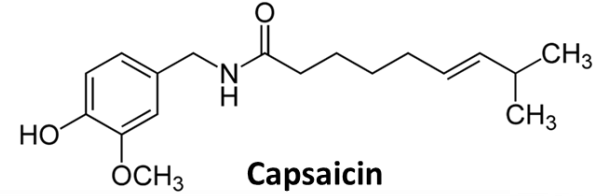
# Background



Capsaicin



# Measuring the hotness of chillies



**Analytical Testing**



**Panel Testing**



**Guessing**



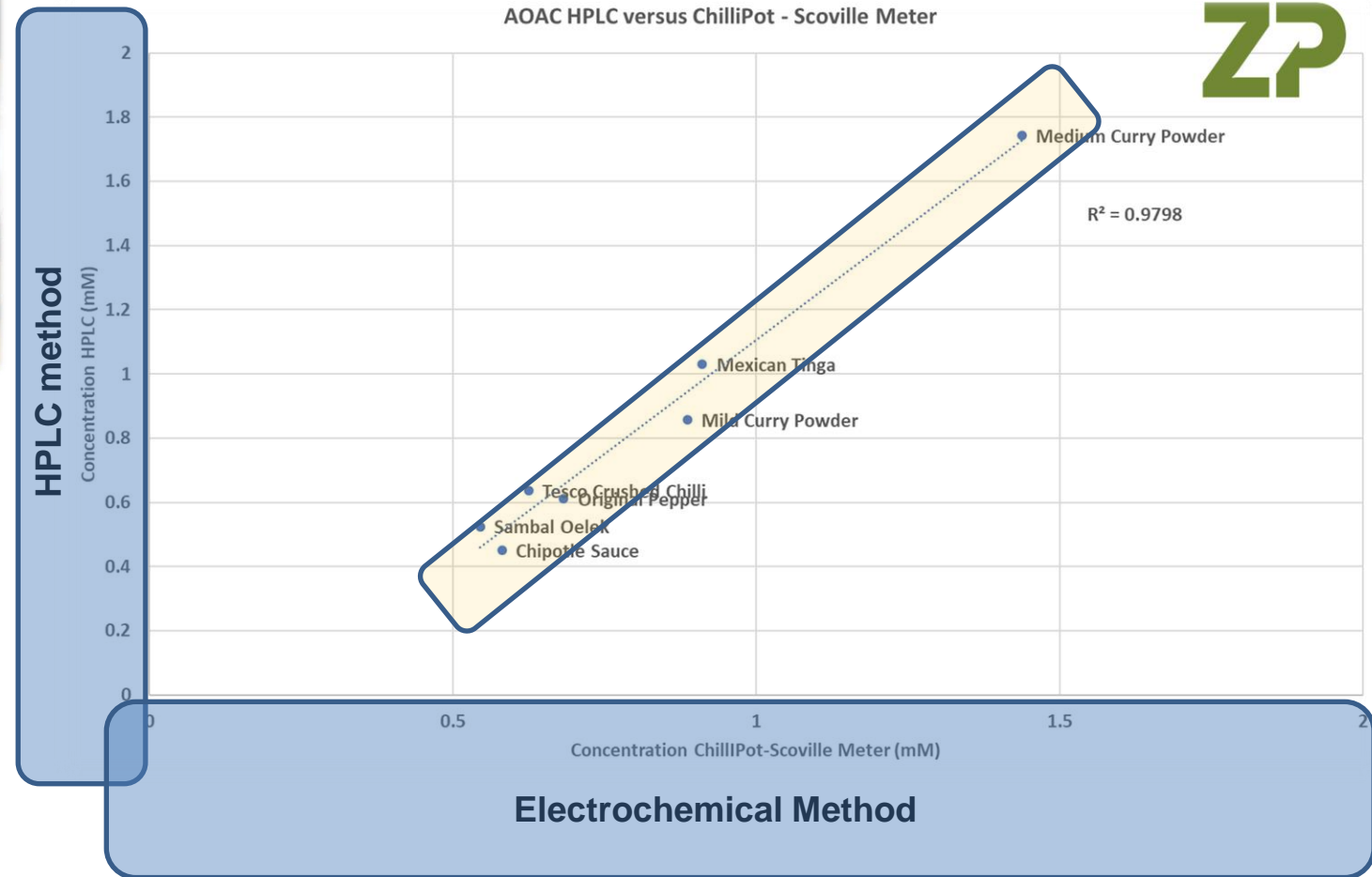
**FoodSense**



# FoodSense

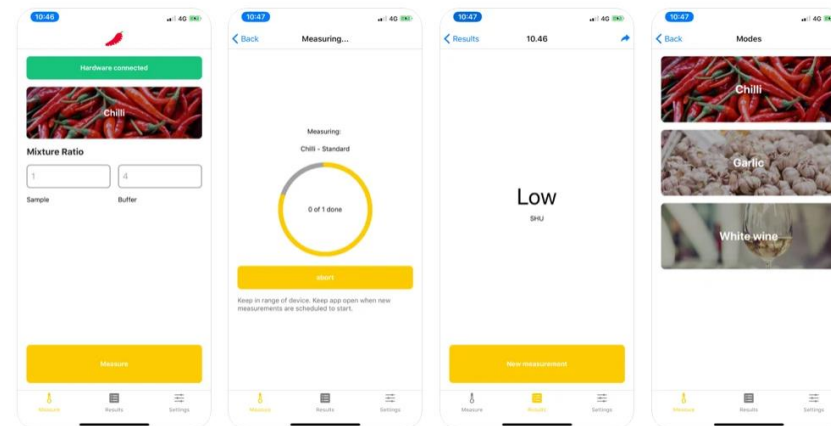
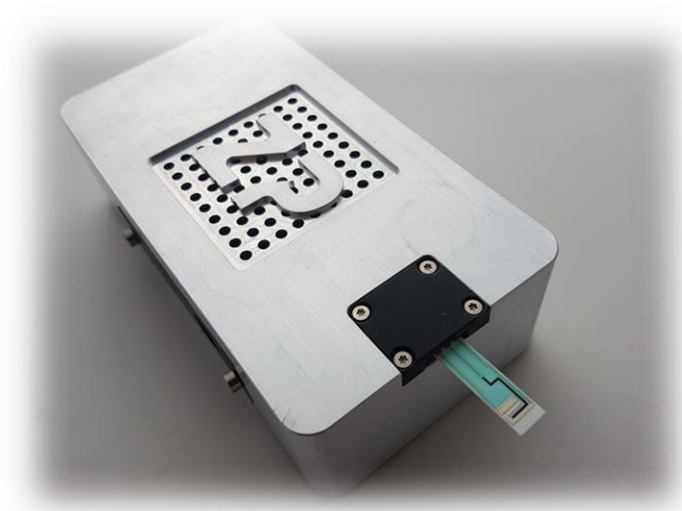


# Validation of shopping list





# Iterations





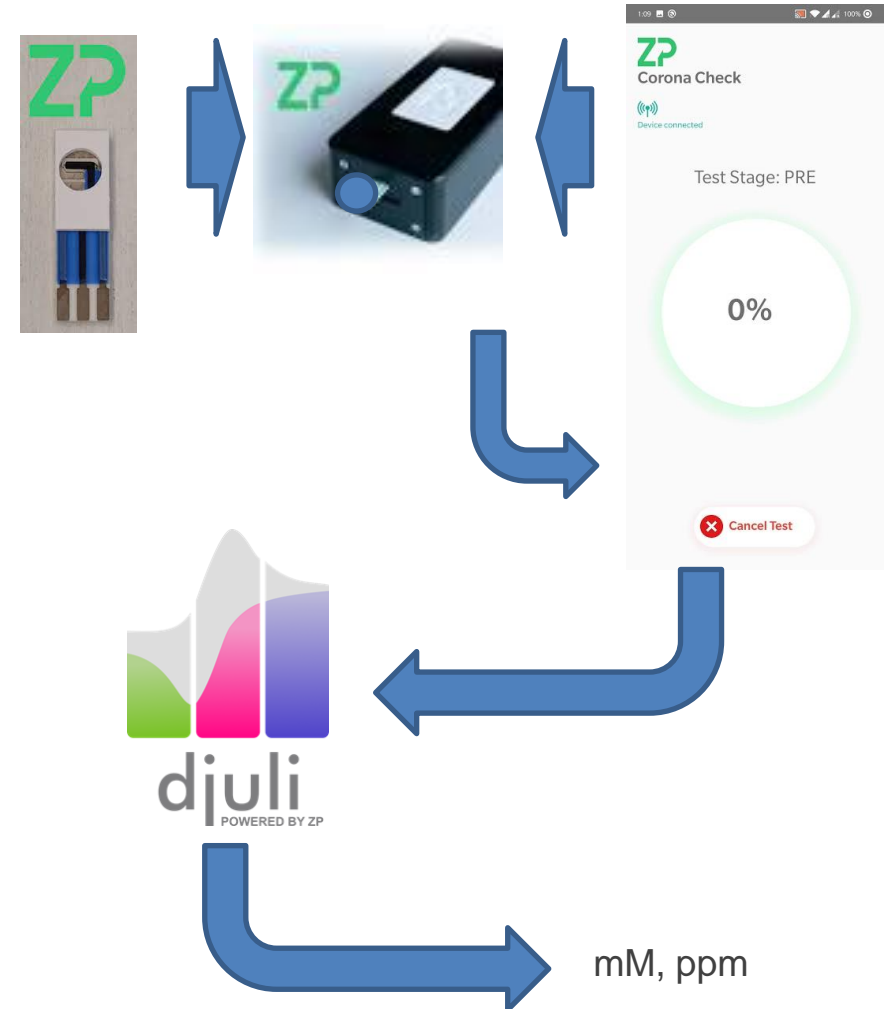
T I N Y



TALKS  
*webcast*

A large, stylized logo consisting of the letters 'Z' and 'P' in a bright green color. The 'Z' and 'P' are interconnected, with the 'Z' having a thick, blocky appearance and the 'P' being more fluid and rounded. The logo is centered within a dark blue rectangular area.

# SenseltAll – Discrete Measurement



T I N Y



# TAS

A large, dark blue rectangular area containing the logo 'ZP' in a bright green, stylized font. The 'Z' and 'P' are connected at the bottom.

T I N Y



# Nitrate



T I N Y



# Call to action

All the easy stuff is done, time for biology  
, biochemistry and chemistry



ZP

**Thank you**



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