

Aplicació de la Intel·ligència Artificial per la millora del tractament i seguiment del Parkinson

Joan Cabestany

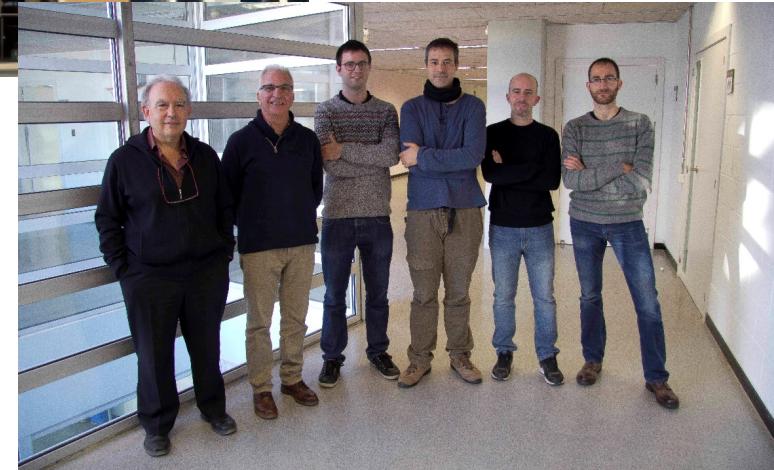
- UPC professor
- Co-founder of Sense4Care SL



El guió de la meva presentació:

- Breu introducció.
 - Un marc de recerca aplicada. La transferència de coneixament a la societat.
- El Parkinson
- Sobre el nostre producte. Característiques i prestacions
- Com s'ha desenvolupat.
 - La Intel.ligència Artificial al rerafons.
 - Implementació
- Algunes conclusions.

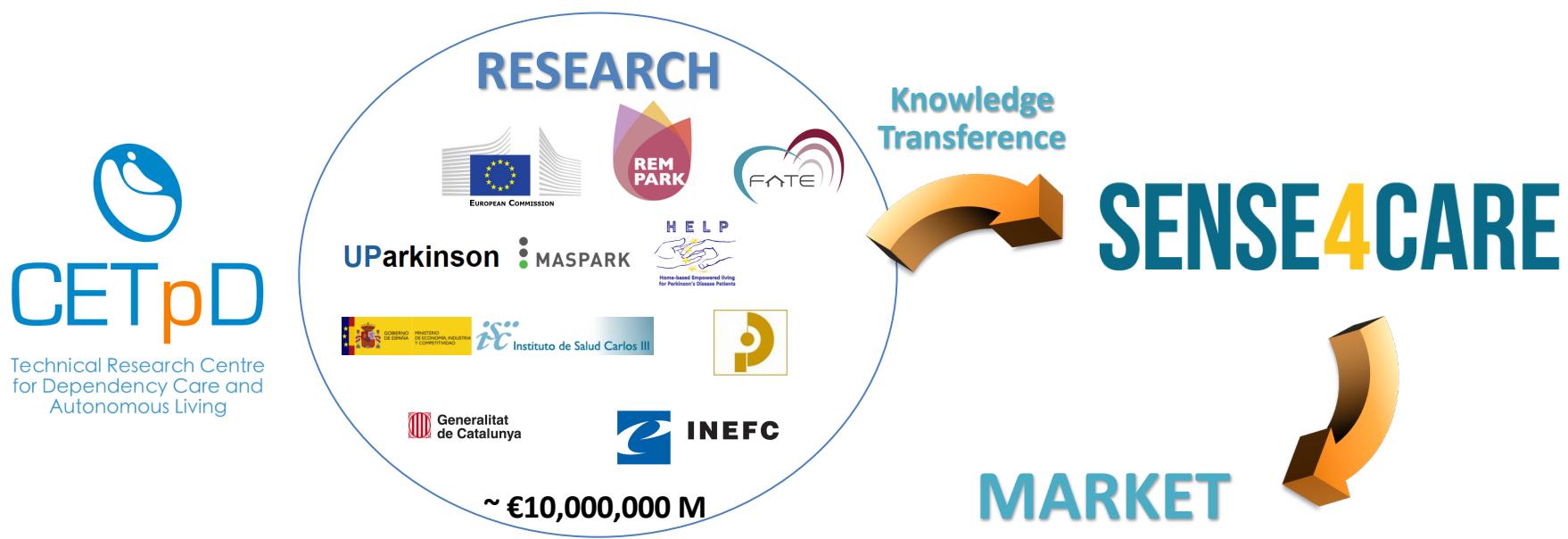
Context de recerca aplicada: bàsicament suportada per finançament de projectes en lliure concorrència i activitat de tesis doctorals.



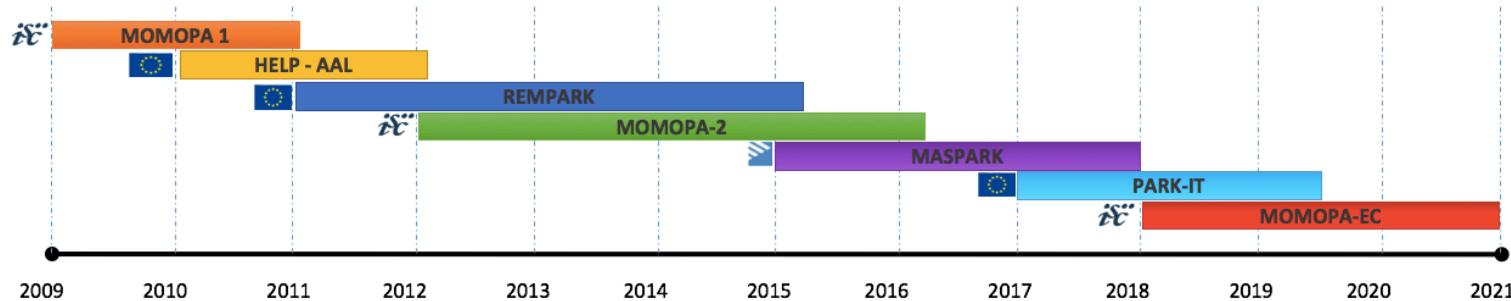
Technical Research Centre
for Dependency Care and
Autonomous Living



La transferència de coneixament a la societat com a repte...



Background



RESEARCH & DEVELOPMENT

2009-2011		MOMOPA 1	15 patients, set the sensor on the waist, first algorithms and analysis of results.
2010-2013		HELP - AAL	1st approach with an apomorphine pump, tests with 6 patients.
2011-2015		REMPARK	>150 patients. Biggest database with inertial data known at patients' home. Focused on algorithms to detect motor symptoms.
2012-2016		MOMOPA-2	40 patients and project focused to determine the ON and OFF state with an inertial sensor.
2015-2018		MASPART	Use of the sensor as a gold-standard. Cueing system and enhancement of algorithms to detect bradykinetic gait and freezing of gait

STAT-ON DEVELOPMENT

2017-2019		PARK-IT	SME Instruments Phase II project to re-design, industrialise, certify, and commercialise a wearable medical device to monitor PD motor symptoms
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Sense4Care team:



Carlos Pérez, PhD
CEO

Electronics

Project management
Clinical trials design
+45 publications



Daniel Rodríguez, PhD
CTO

Industrial Engineering

Machine Learning
Quality control and HW
+45 Publications



Joan Calvet
COO

Business Management
Master in Marketing

Business development
+10 years experience in Start-ups



Martí Pié
Software

Electronics and Automation

Firmware, Hardware and Software design



Anna Santamaría
Assistant

Social and Economics Administration

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Joan Cabestany, PhD



Xavier Castillo, PhD
TEMPOS 21
now
Worldline



Andreu Català, PhD



El producte:

HOLTER FOR PARKINSON



Designed at **PARK-IT 2.0**, SME Instrument Phase 2, H2020 –
SMEINST – 2 – 2016 – 2017, Project number: 756861

 PARK-IT2

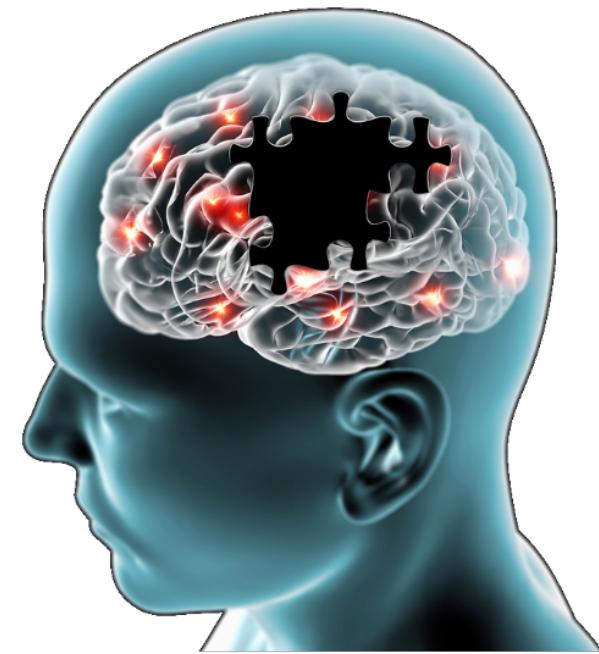
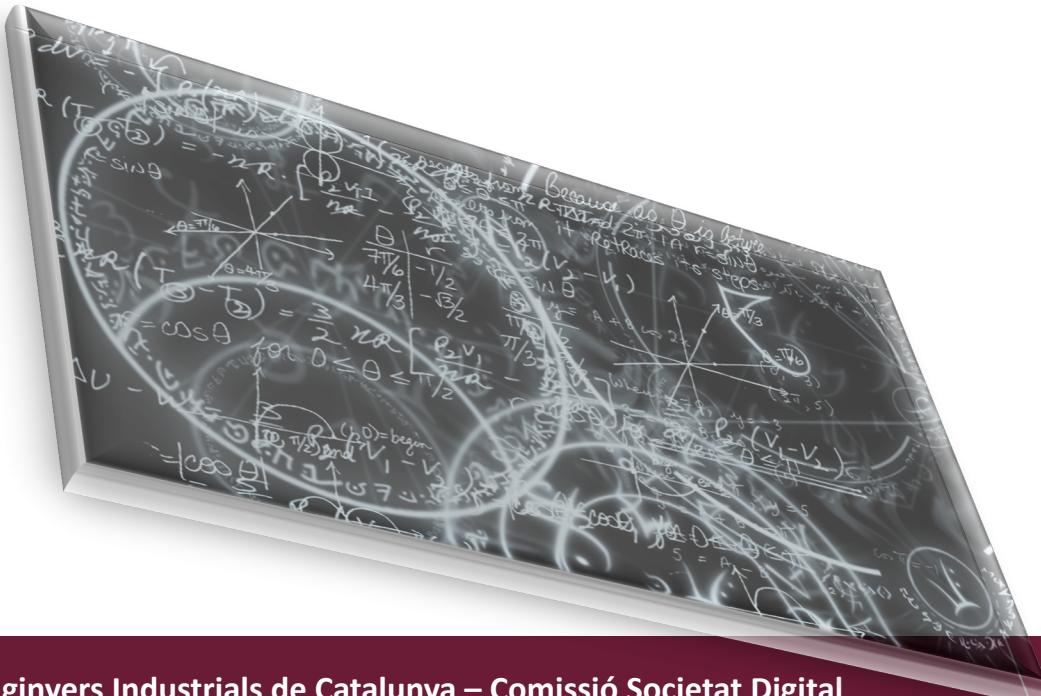


0051
EC CERTIFICATE

Certificate No 2042/MDD

La enfermedad de Parkinson

- ***No se conoce con certeza su origen***
- Origina esencialmente la pérdida de neuronas dopaminérgicas y otras subcorticales en la ***Substantia Nigra***
- ***A dia de hoy, no tiene curación.***



Parkinson's disease

Is the 2nd most common neurodegenerative disease

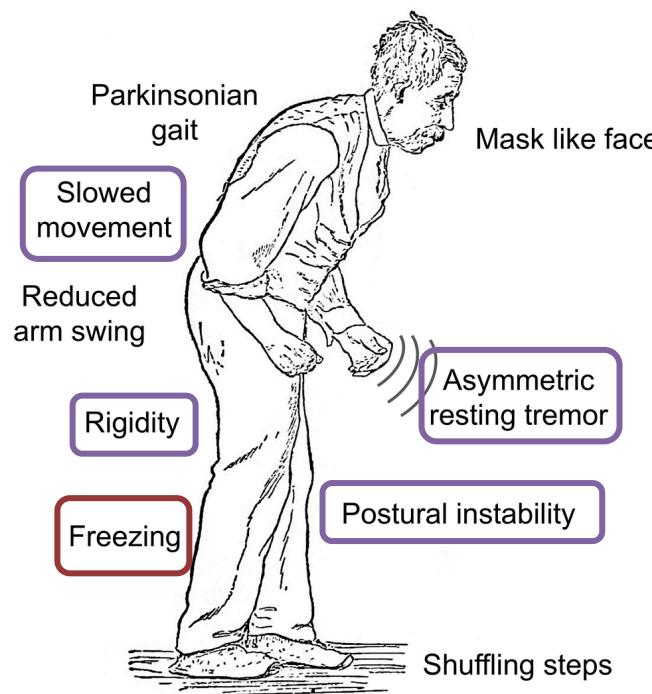


1.200.000
Affected in EUROPE

People with PD in the world



Parkinson's disease



Síntomas del Parkinson

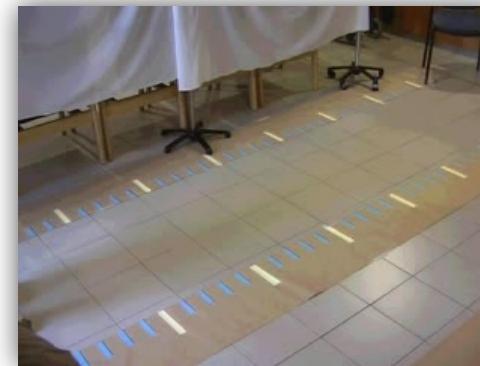
- Bradicinesia
 - Lentitud de movimiento*
- Bloqueo de la marcha (Freezing of Gait, FoG)
 - Parada repentina de la acción de caminar*
- Discinesias
 - Movimientos coreicos incontrolados*

Síntomas del Parkinson

- Estados motores



Con medicación: ON



Sin medicación: OFF

Síntomas del Parkinson

- Bradykinesia
- Slowness of movement
- Reduction of step length
- Less cadence
- Less stride speed
- Less fluidity
- Movement difficulties
- Speech affected



Síntomas del Parkinson

- Dyskinesia
- Blood dopamine excess
- Uncontrolled choreic movements
- Produces injuries, anxiety, depression, gait assymetry, and fall risk



Síntomas del Parkinson

- Freezing of Gait
- Sudden incapacity to keep an efficient gait
- According to patients: “as if feet were glued to ground”
- Direct relation with falls



Context dependent

Síntomas del Parkinson

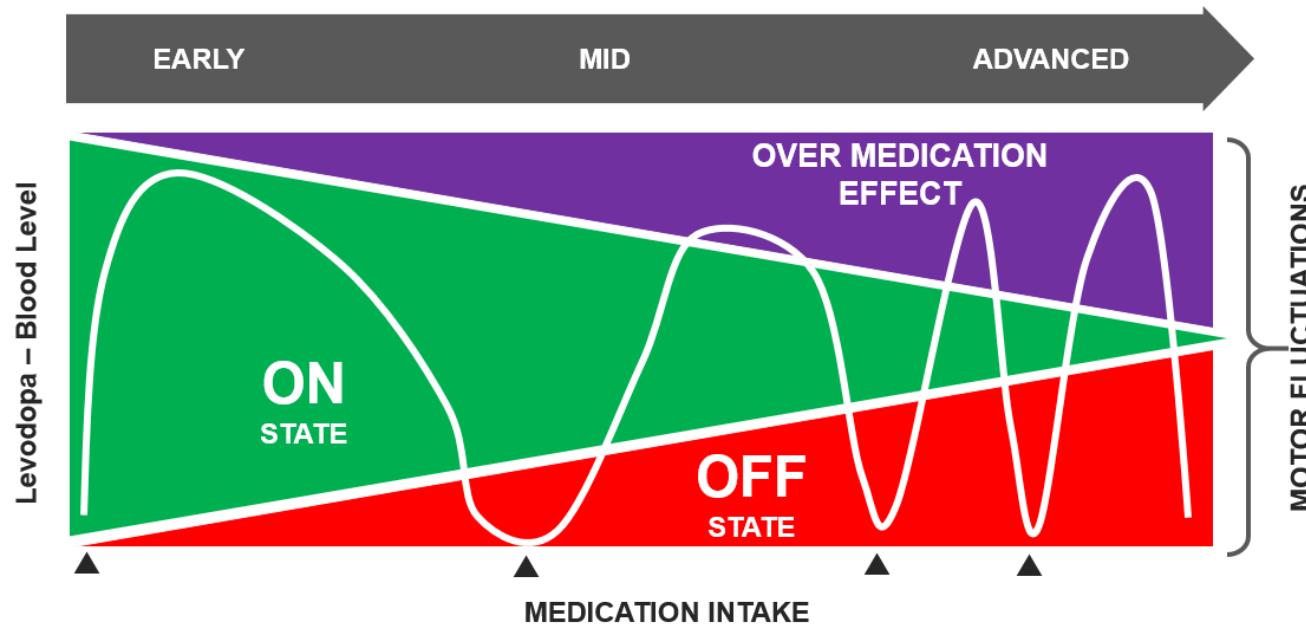
- Cueing at Freezing of Gait

- Unfreeze trick
- Works in some patients
- Useful at bradykinetic gait, too
- Visual, auditive, haptic



Parkinson symptoms

PD EVOLUTION

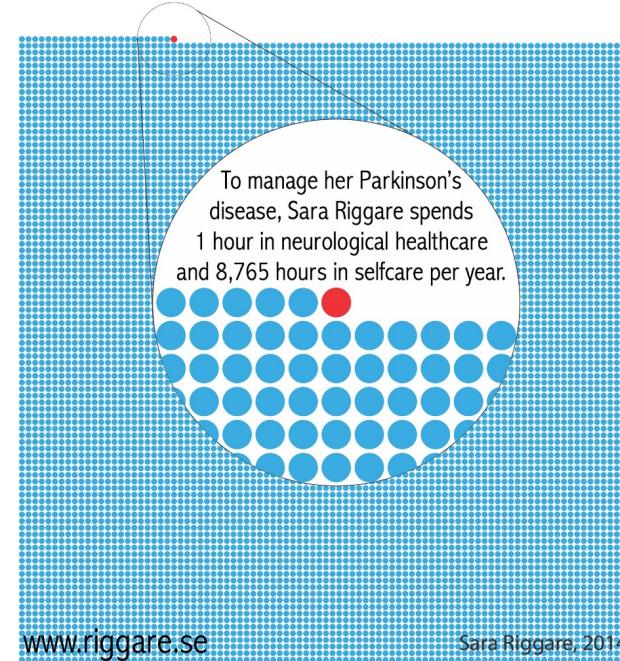


Síntomas y tratamiento del Parkinson



Sara Riggare, Parkinson's Disease patient (45)

"Veo a mi neurólogo 2 veces al año. Media hora en cada visita. Es un total de 1 hora de cuidado de salud profesional sobre mi enfermedad. Durante el año me cuido durante 8765 horas, aplicando mi conocimiento y experiencia, junto con la información que me dice el neurólogo lo mejor que puedo."

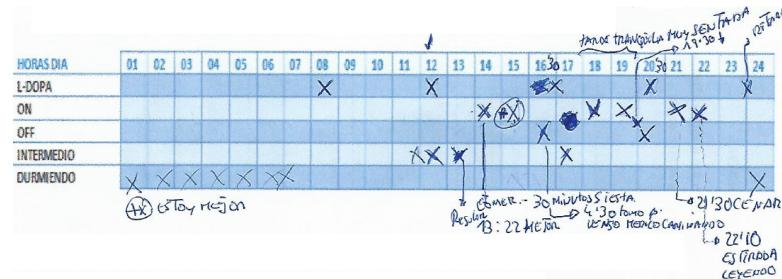


<https://www.youtube.com/watch?v=-bqSY5Rtol>

El problema: la necesidad de una evaluación más objetiva y en condiciones de vida normal.

- Punctual and short evaluations
- Subjective questionnaires, chaotic diaries...

	5h	6h	7h	8h	9h	10h	11h	12h	13h	14h	15h	16h	17h	18h	19h	20h	21h	22h	23h	24h	1h	2h	3h	4h	
L-DOPA	6/1		4/4				13			16/4		16/2		20											
ON	X	X		X																					
OFF	X		X	Y			X			X	V			X		V									
INTERMEDIO																									
OFF																									
DURMIENDO																									



B. 1. DIAGNÓSTICO DE SÍNDROME PARKINSONIANO

B. 1. 1 Bradicinesia

(Lentitud en la iniciación del movimiento voluntario con progresiva reducción en la velocidad y amplitud de las acciones repetitivas)

- No 1
- Sí 2

B. 1. 2 Tiene al menos uno de los siguientes:

1.- Rigidez muscular

- No 1
- Sí 2

2.- Temblor de reposo de 4-6 Hz

- No 1
- Sí 2

3.- Inestabilidad postural no causada por compromiso visual, vestibular, cerebeloso o propioceptivo

- No 1
- Sí 2

STAT-ON: How it Works?



Auto-calibration (the device adapts to each patient)
7 battery life working continuously



Only 3 parameters to set up the device

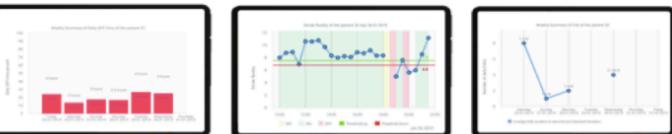
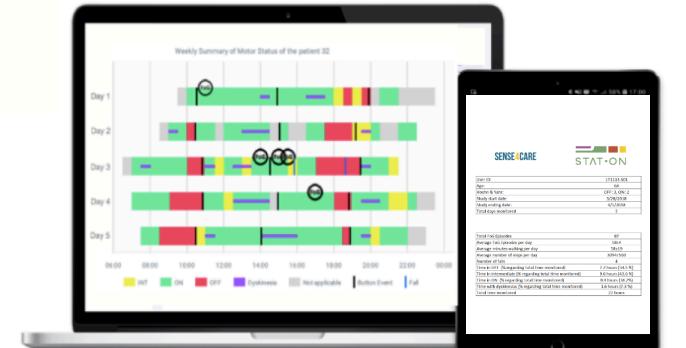
1

THE NEUROLOGIST CONFIGURES THE APP ACCORDING TO EACH PATIENT



2

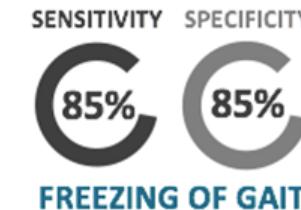
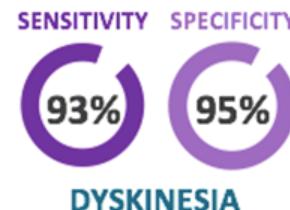
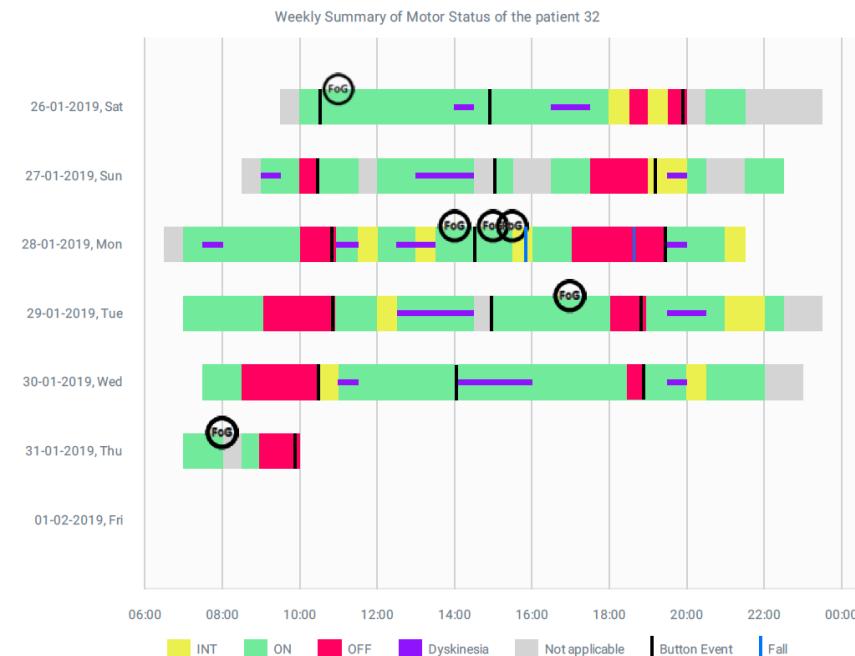
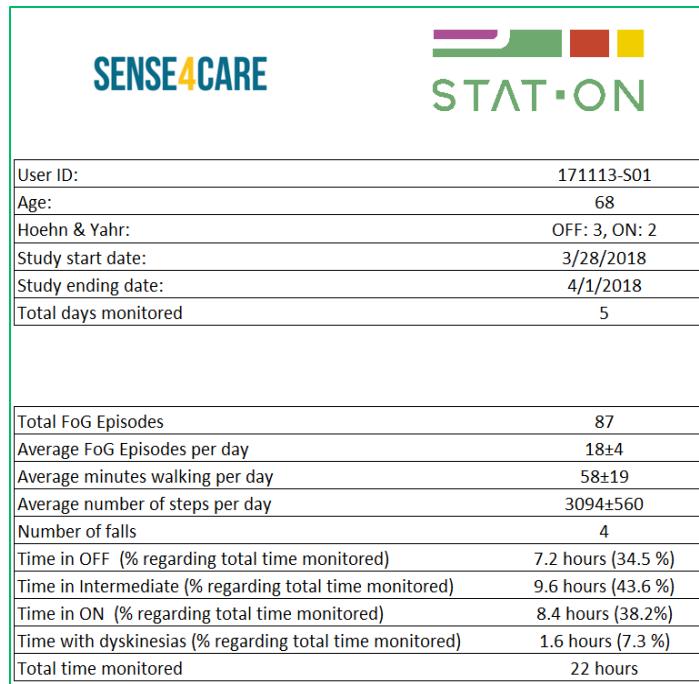
THE PATIENT WEARS IT 7 DAYS IN DAILY LIVING CONDITIONS



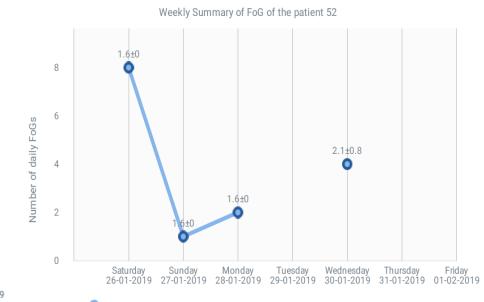
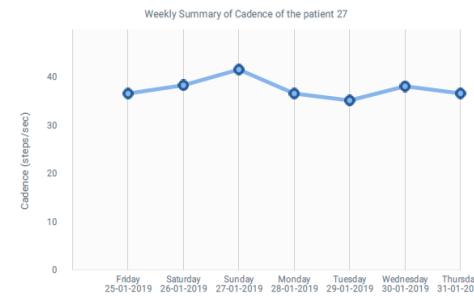
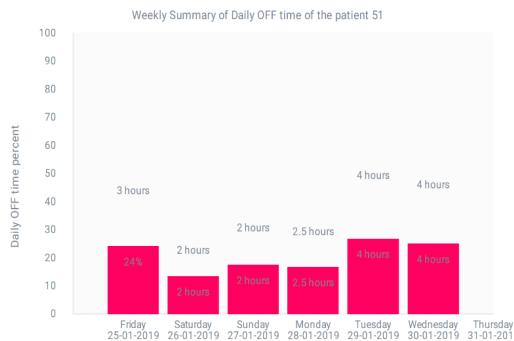
3

THE NEUROLOGIST DOWNLOADS IN FEW SECONDS THE REPORT OF THE PATIENT'S STATE VIA BLUETOOTH

Resultados en formato de informe:



Resultados en formato de informe:



Hours in
OFF

Cadence

Step length

Stride
Speed

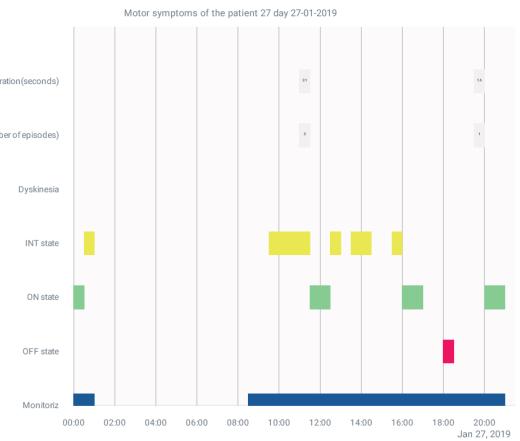
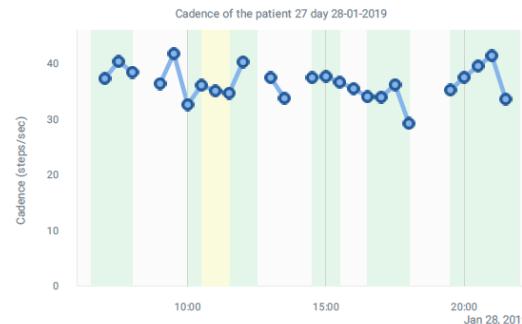
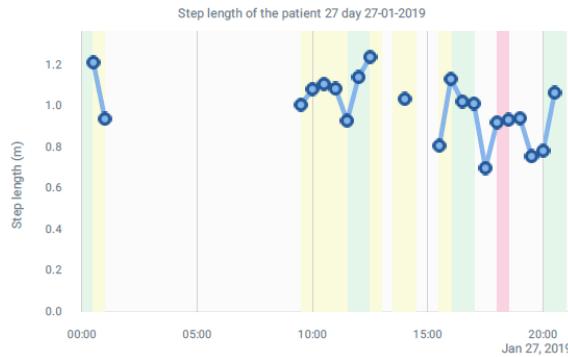
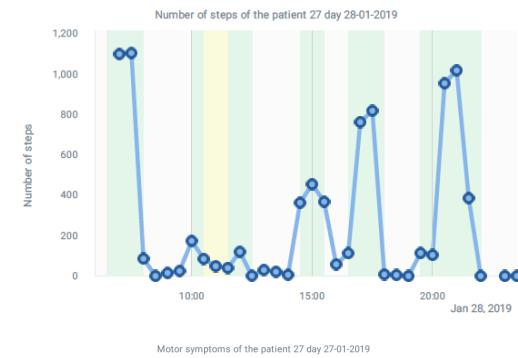
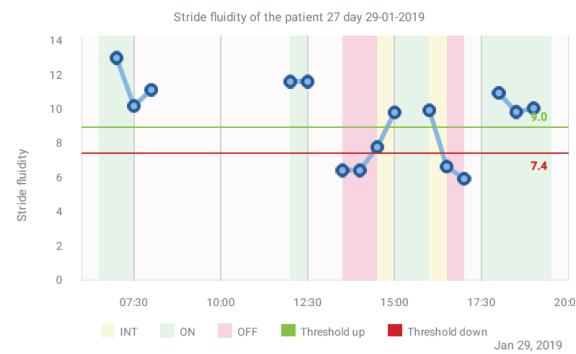
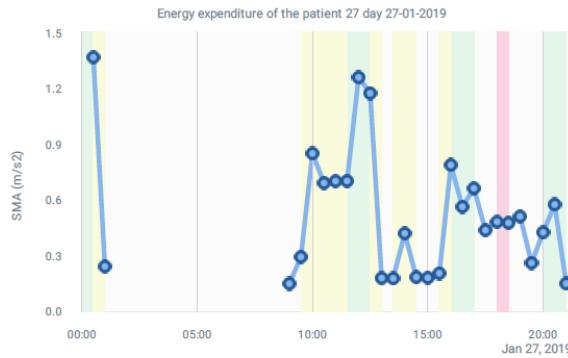
Stride
Fluidity

Number of
Steps

Minutes
walking

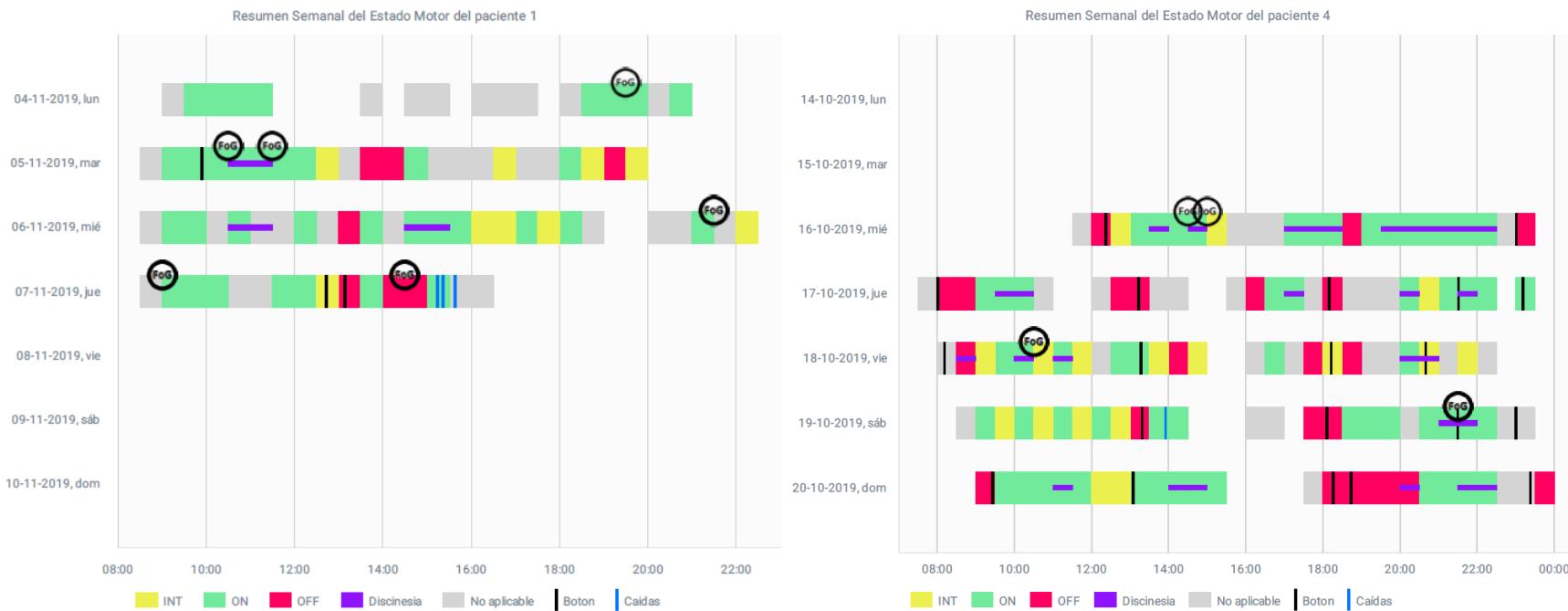
Energy
Expenditure

Resultados en formato de informe:

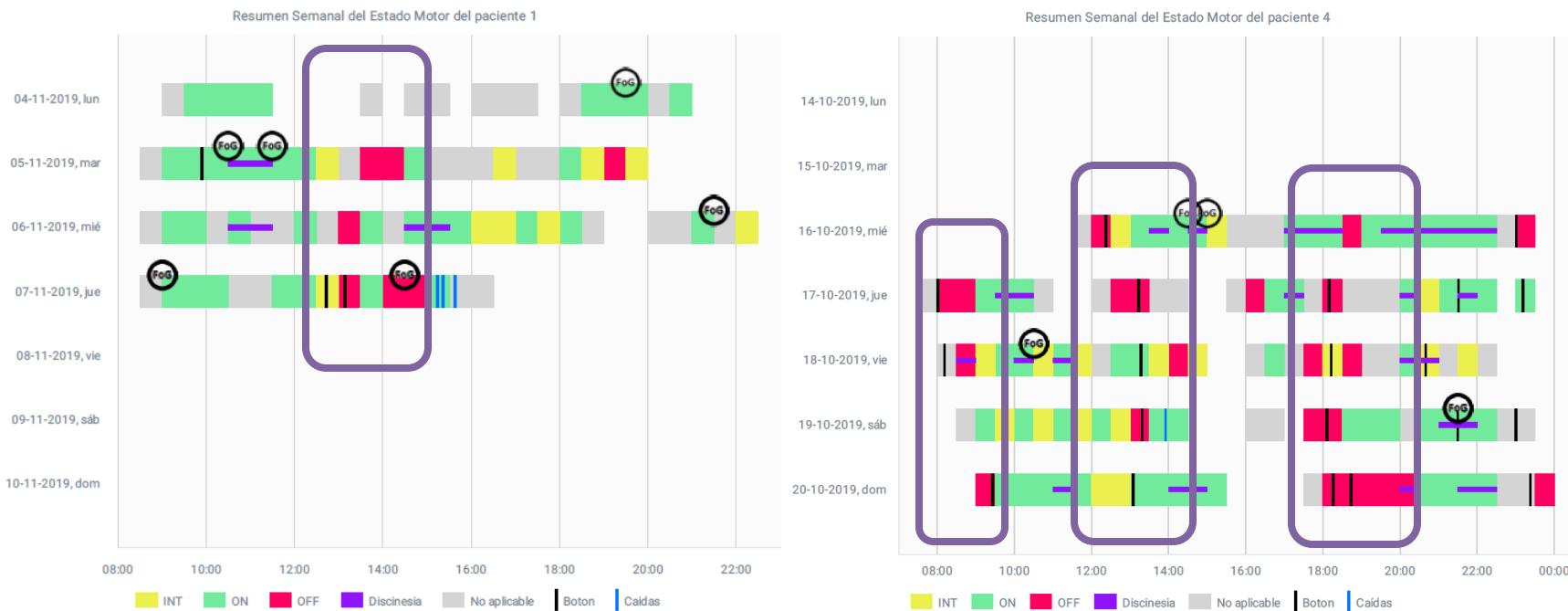


Daily information of each item

Results

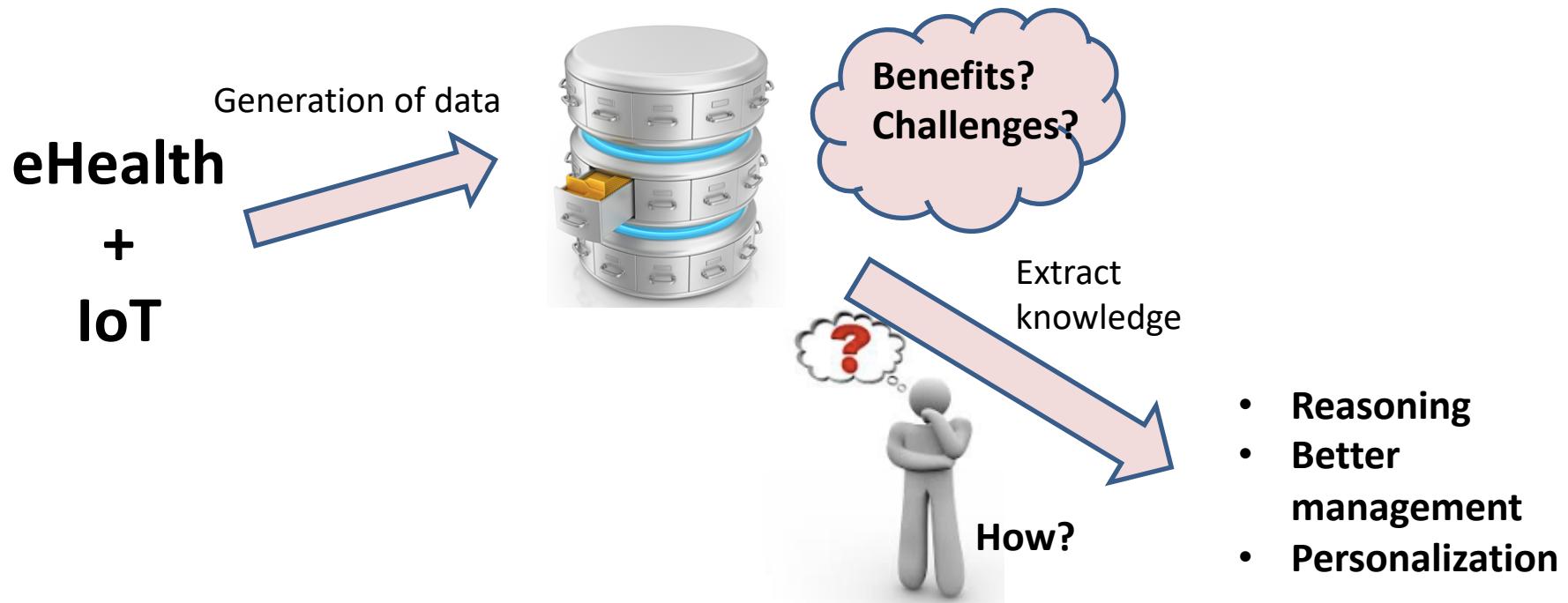


Results



Artificial Intelligence concepts

According B.Mesko (2017) or J.Qi (2017): “*AI is the science and engineering of making intelligent machines, especially intelligent computer programs*”, or more concrete: “...is the capacity of a computer program to **perform tasks or reasoning processes** that we usually associate to intelligence in a human being”



AI: a personal view



Data coming from:

- Wearables
- EHR (Electronic Health Record)



Learning Database

- Structured
- Non-structured

Rule based Engines
(server or Fog level)

Treatment
of
Data

Possible outputs:

- Personalized diagnosis
- Personal treatments
- Recommendations
- Alarms, alerts and re-adjustments

Extracted
Knowledge

- Machine learning
- Expert knowledge

AI: a personal view (2)

How to get a good Learning Database?



- Structures Database from specific experiments (pilots) with real participants, generating data according a given approved protocol.

DATA + labelling by experts + annotations → GOLD STANDARD

- Non-structured Database from people just giving access to their data, compiled from sensors or wearables

DATA + methods of analysis + similitude methods

→ No GOLD STANDARD
→ Intrinsic patterns

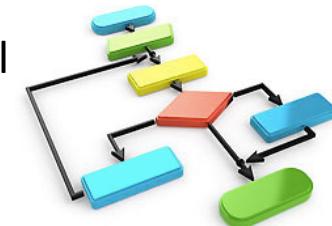


Learning process: model parameters calculation

Obtained results on data not contained in the learning Database

Model to be applied: depends on the problem and the computational requirements.

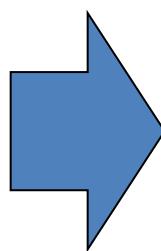
- Calculated parameters
- Generalization capability



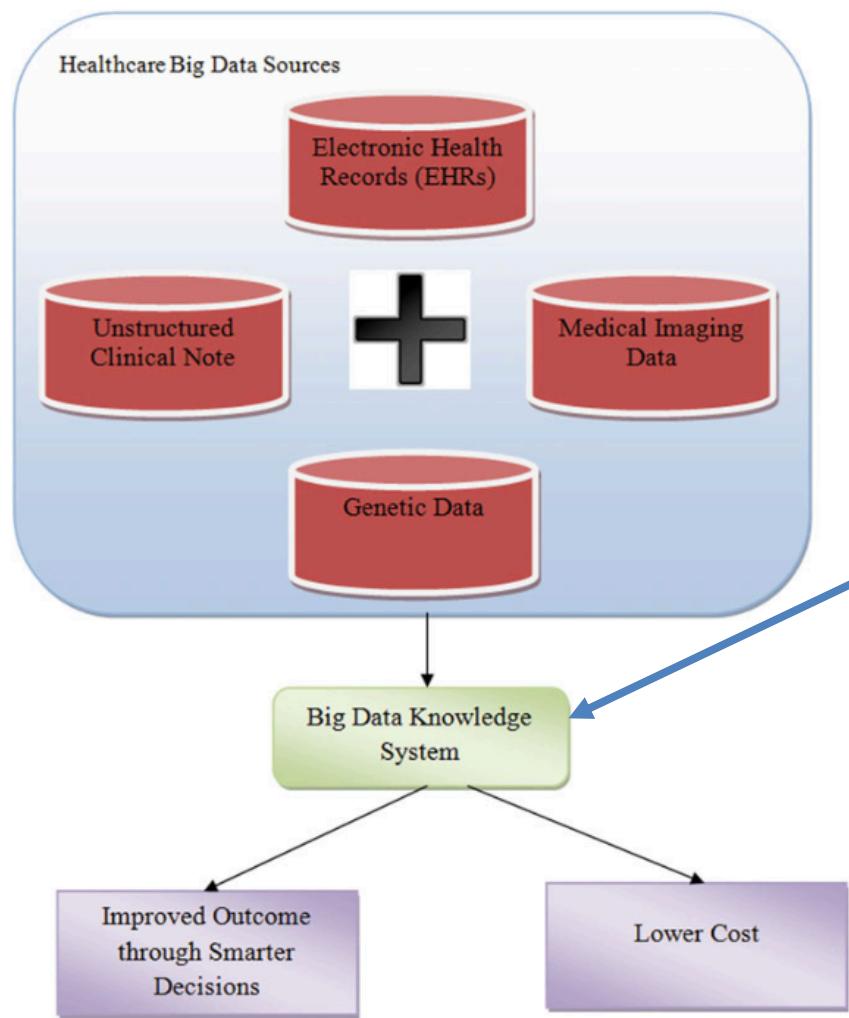
Usual question: how big must be the learning Database?

- ***Artificial intelligence***: Designates a set of techniques implemented for purposes of **allowing machines to simulate human intelligence** in order to resolve complex problems. It can be used in a variety of approaches, notably **automatic learning** (or machine learning) and **deep learning**. The latter imitates neuronal function in the human brain for purposes of teaching a machine how to independently identify and classify data.

Thanks to artificial intelligence, the ever-increasing volume of data and growing computing power, it is now possible to construct algorithms that generate automatic and more accurate solutions to medical problems.



- How to extract knowledge from specific or formal data?
- Implementation of learning approaches?
- Can be done in real time?



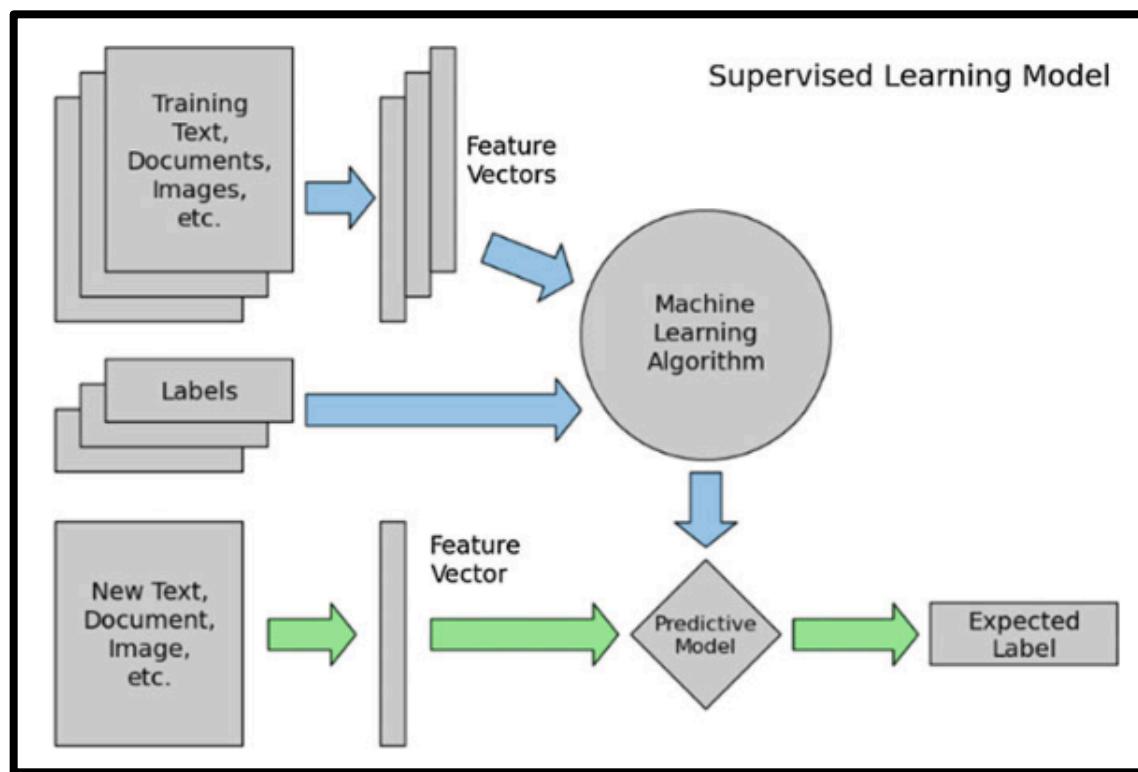
Provider Knowledge: Medical experts have both tacit and explicit knowledge. In general, every doctor is required to identify typical medical diagnosis or details from various available sources. Years of experience in medical diagnosis is used to take better decisions.

Patient Knowledge: Tacit knowledge is developed from the patients and it is considered “health status”. Generally speaking, practitioners and doctors may not know about the current and past medical conditions of the patients.

Organizational Knowledge is also a vital role in patient treatments and diagnoses for preventative maintenance and illnesses. Most medical organizations have other familiar resources that are available for doctors and patients to contact.

Machine learning algorithms: supervised learning

Supervised learning is a type of learning which is appropriate when correct results are assigned to the training instances that can predict the progress of learning. This is a very common method in classification problems where the goal is mostly to get the computer to learn a classification system that is already created.



Steps in Supervised Learning:

- Data Preparation
- Choosing appropriate Algorithm
- Fit appropriate Model
- Selection of appropriate validation methodology.
- Test and Update
- Using final model for prediction

Importance of Supervised Learning Algorithms in Big data Analytics:

Machine learning is a very ideal solution for exploiting new opportunities from a huge volume of data as it requires **minimum human interaction**. Also this methodology is **data driven** and runs at machine scale. It is also capable of handling **huge variety of variables** coming from **heterogeneous sources**.

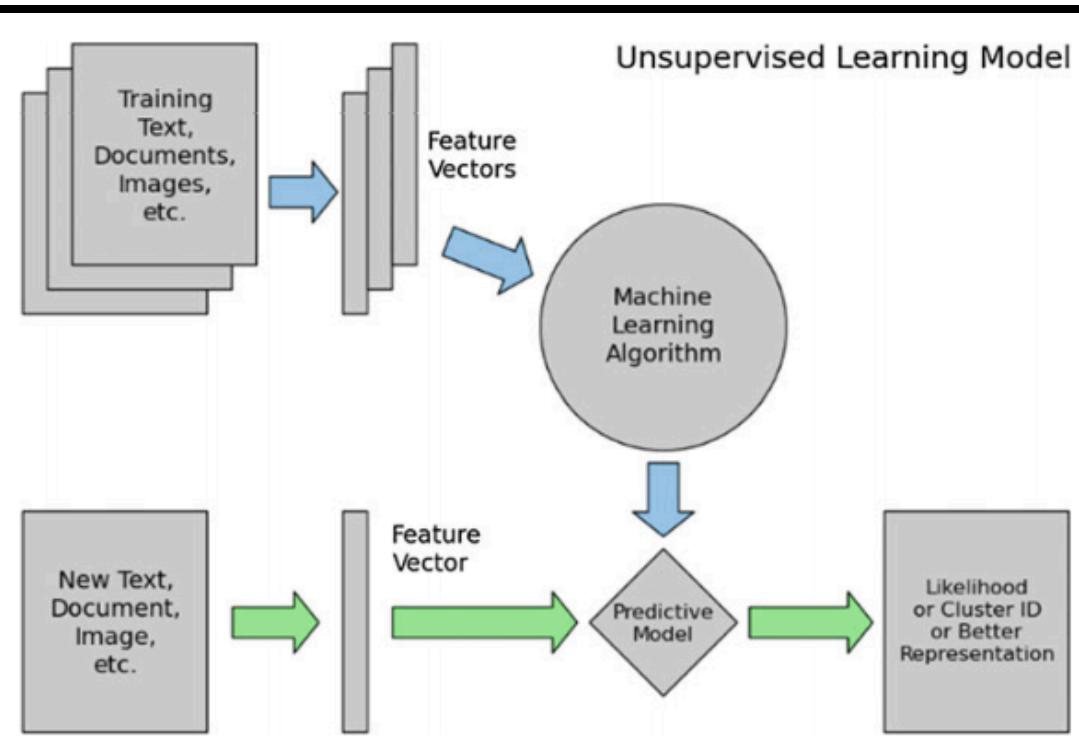
Very common used algorithms in supervised learning:

- SVM – Support Vector Machines (useful both for classification and regression)
- Naïve Bayes algorithm (useful for classification purposes)
- Decision Trees Classifiers



Machine learning algorithms: unsupervised learning

Unsupervised learning is more complicated approach than supervised learning. Here the **objective is to learn something by the computer by its own**. There are primarily two approaches available in this type of learning.



- The first approach is teaching the agent with the help of **reward system** which is an **indicator of success**. This approach is most suitable into the **decision problem** framework where the goal is making decisions for maximizing rewards instead of producing a classification.
- The second type of approach is **clustering** where the goal is finding **similar patterns** in the training dataset instead of **maximizing a utility function**.

Common Algorithms in Unsupervised learning:

- **Clustering Algorithms:** Clustering is a popular concept which groups organization of unlabeled data based on similarity.
 - Bayesian Algorithms: The major goal of this kind of algorithm is to generate a posteriori distribution over the collection of all partitions of the data.
 - Hierarchical Algorithms: These type of algorithms find successive clusters using the clusters used previously.
 - Partition Algorithms: These type of algorithms find all clusters at the same time but can also be used as divisive algorithms in the hierarchical clustering. **K-means clustering** algorithm resides in this group.
- **Dimensionality Reduction Techniques:** In the world of big data, the volume of dataset increased tremendously and it leads to lots of redundancy. So it needs a treatment of dimensionality reduction to remove unwanted dimension.
 - Missing values
 - Random Forest
 - Principal Component Analysis - PCA

Please, take a look on main results and applicability of the REMPARK project...

River Publishers Series in Biomedical Engineering

Parkinson's Disease Management through ICT: The REMPARK Approach

Editors:

Joan Cabestany, Universitat Politècnica de Catalunya UPC, Barcelona, Spain

Àngels Bayés, Uparkinson Teknon, Grupo Hospitalario Quirón, Barcelona, Spain

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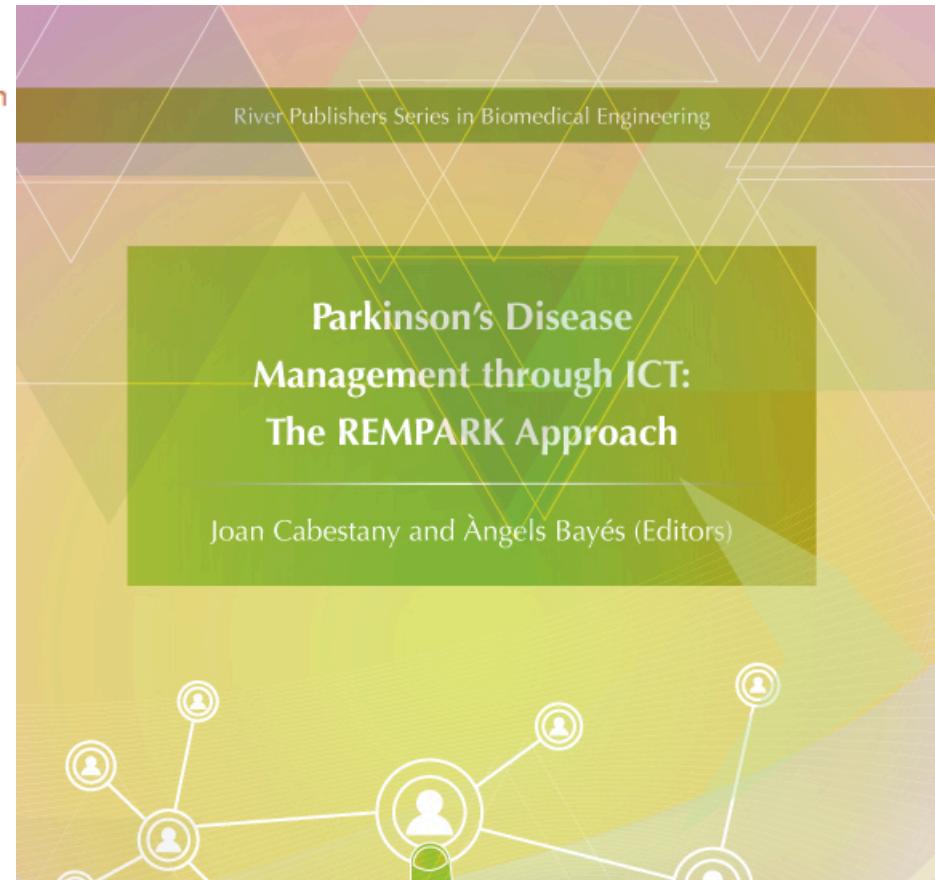
doi: 10.13052/rp-9788793519459

Price: €0.00

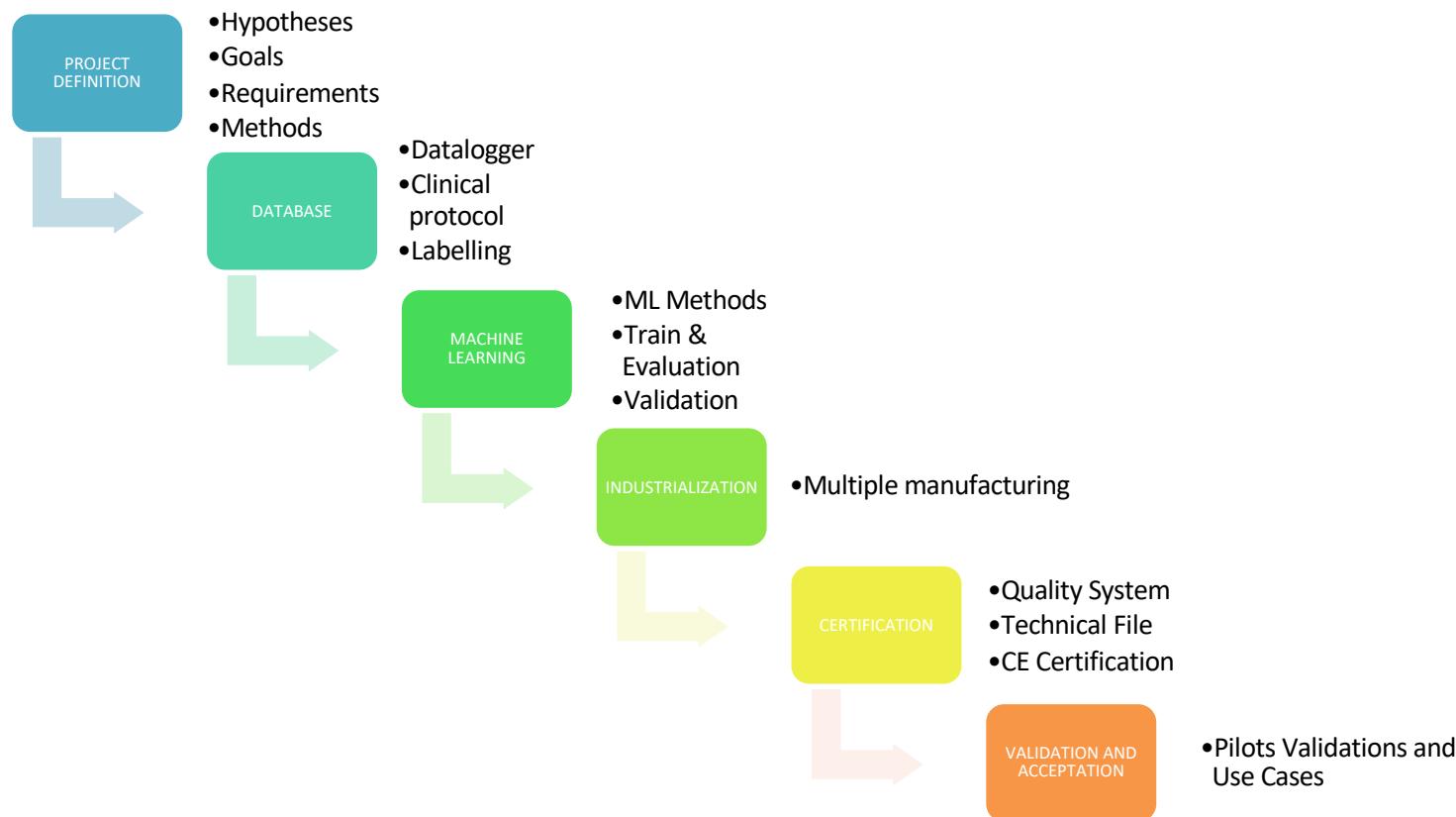
Available: July 2017

Print book available at List Price

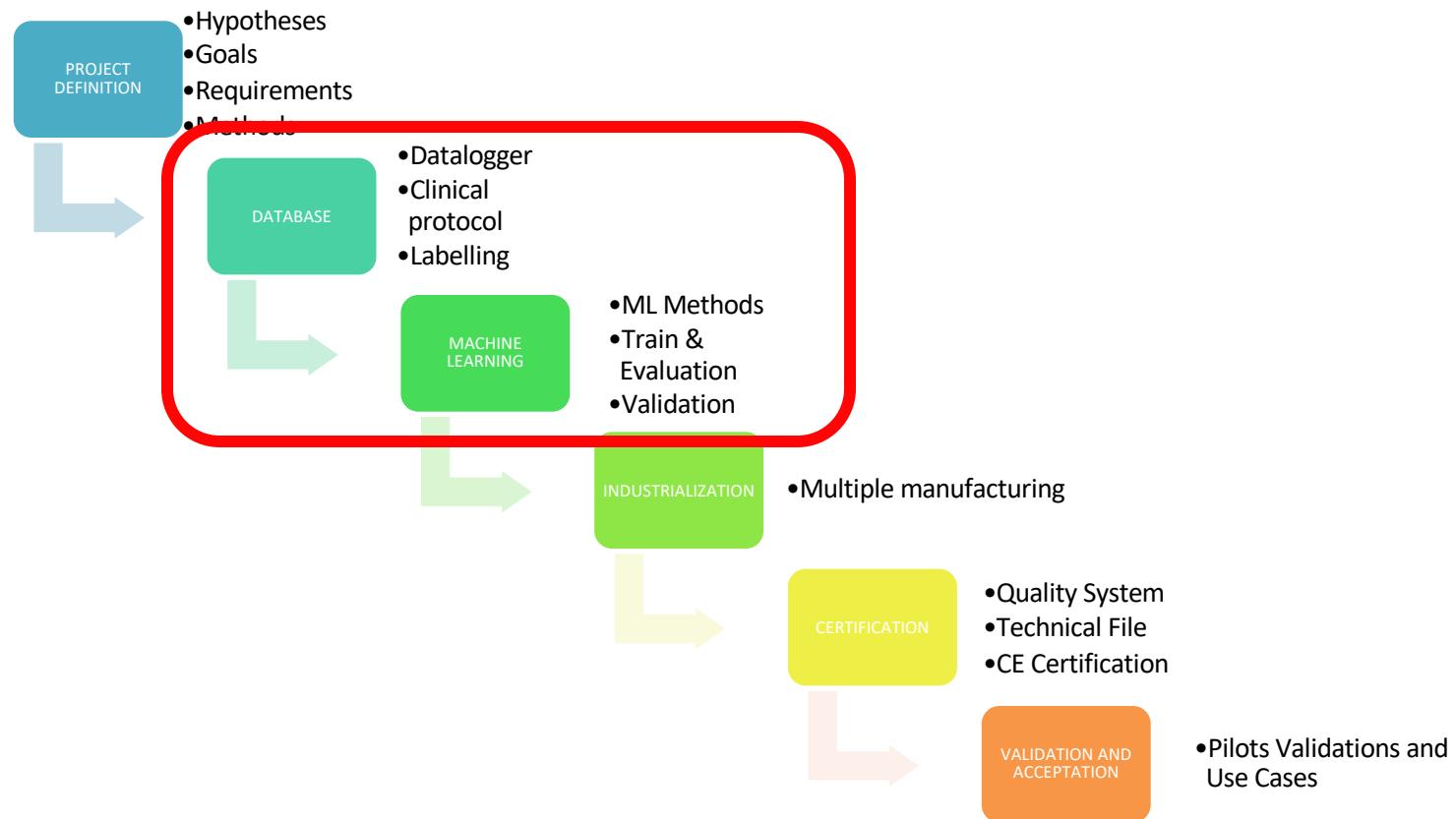
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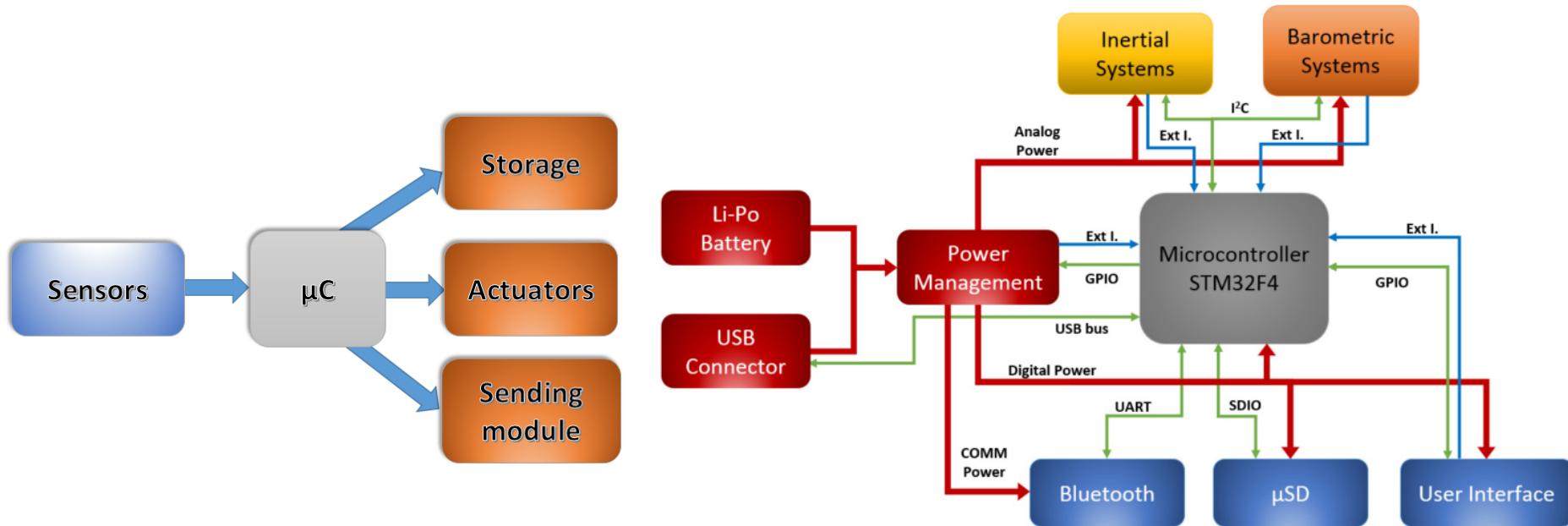
Project roadmap



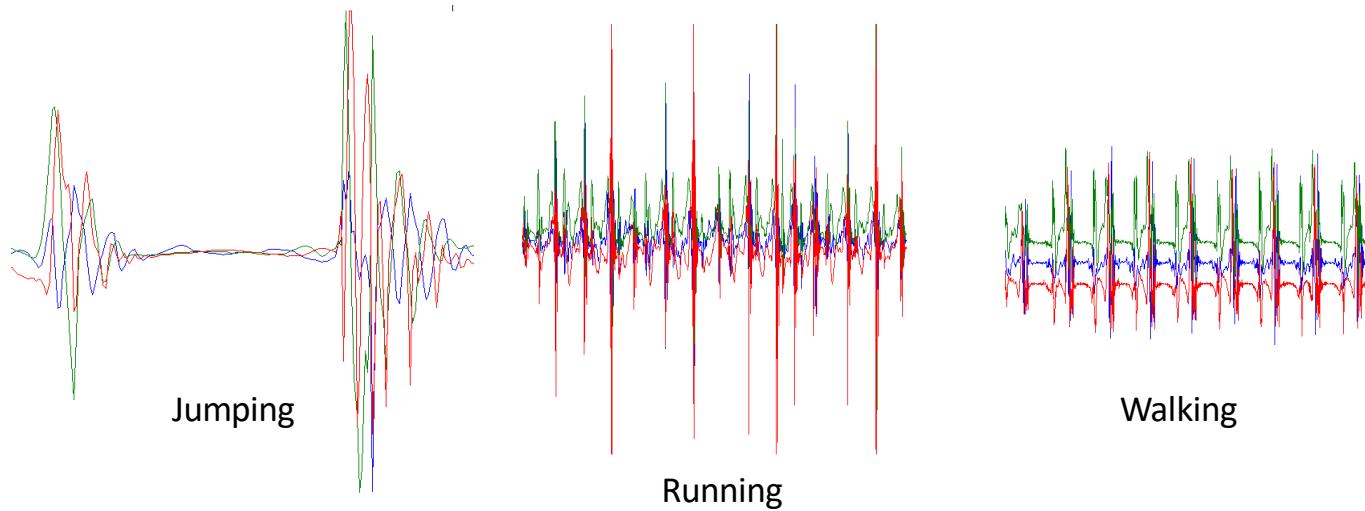
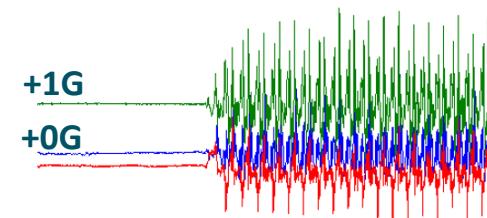
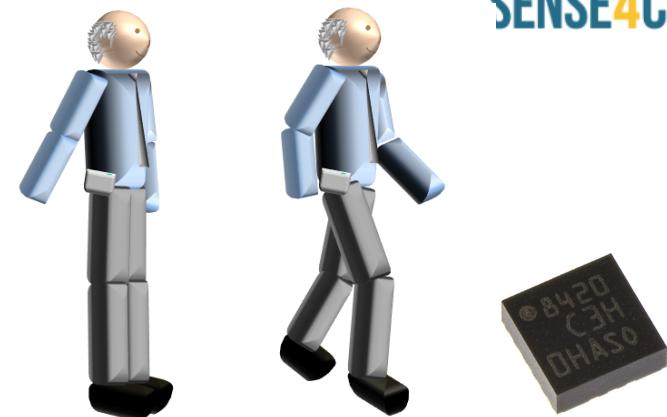
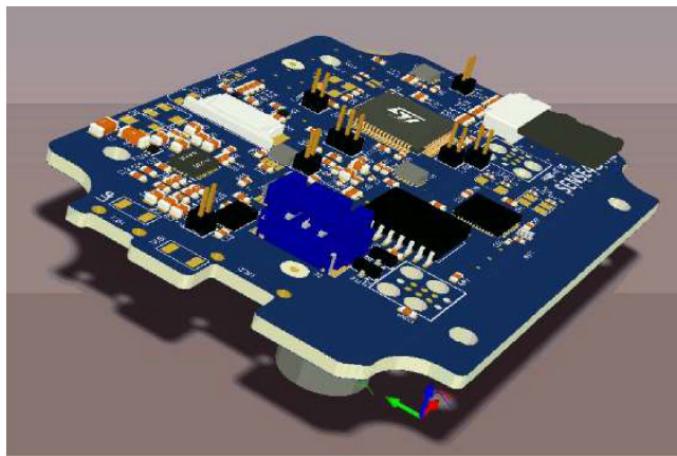
Project roadmap



Inertial systems



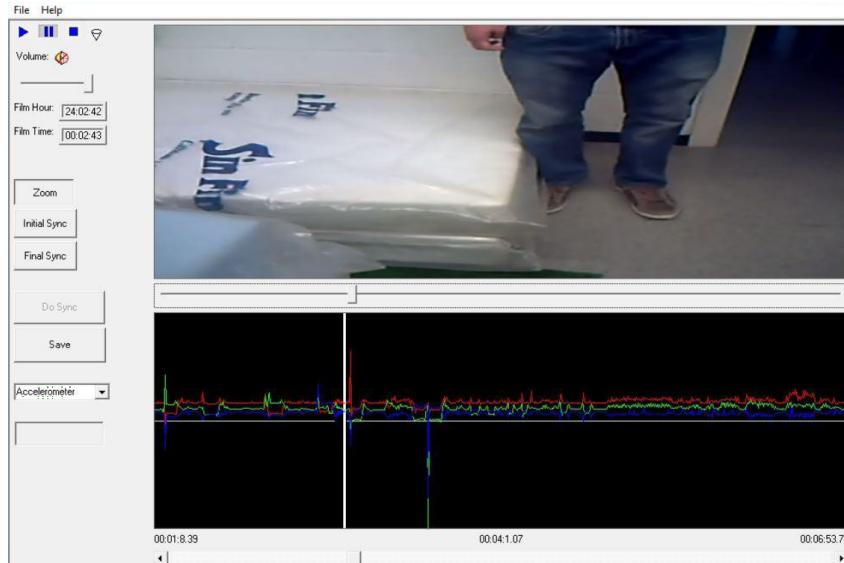
Inertial systems



Clinical protocol

- **Cubrir todos los movimientos posibles**
- Criterios de inclusión y de exclusión
- Grupo control
- Ambientes lo más cercano a la realidad
- Cobertura tecnológica
 - Sensores
 - Cámaras
 - Expertos clínicos
- Comités éticos, aceptación de la AEMPS??

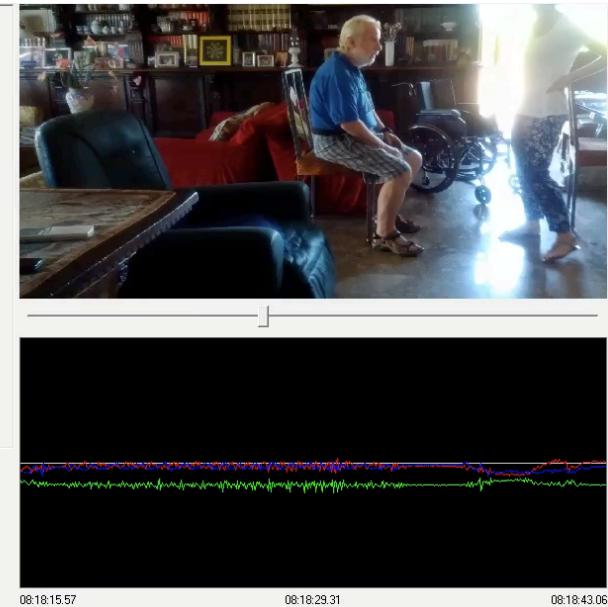
Clinical protocol: Data base construction



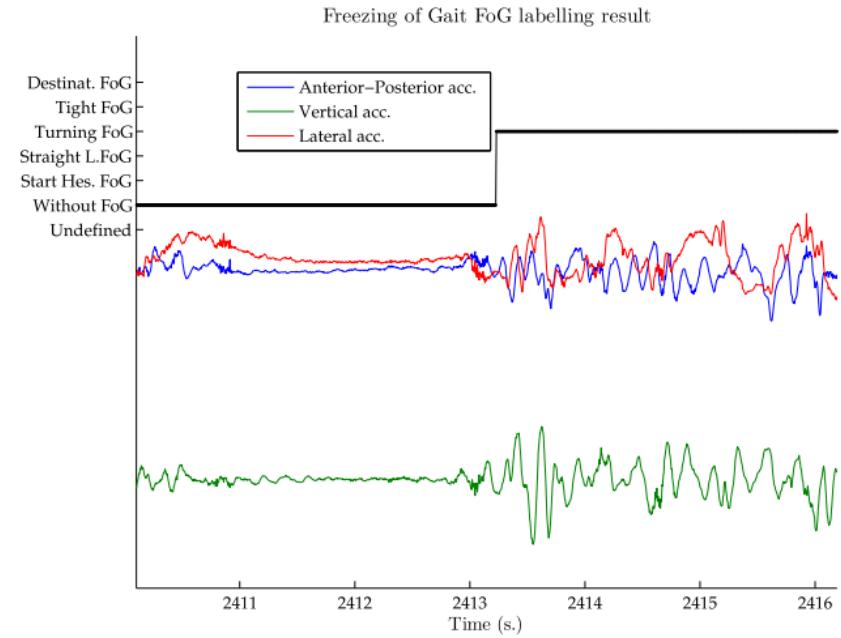
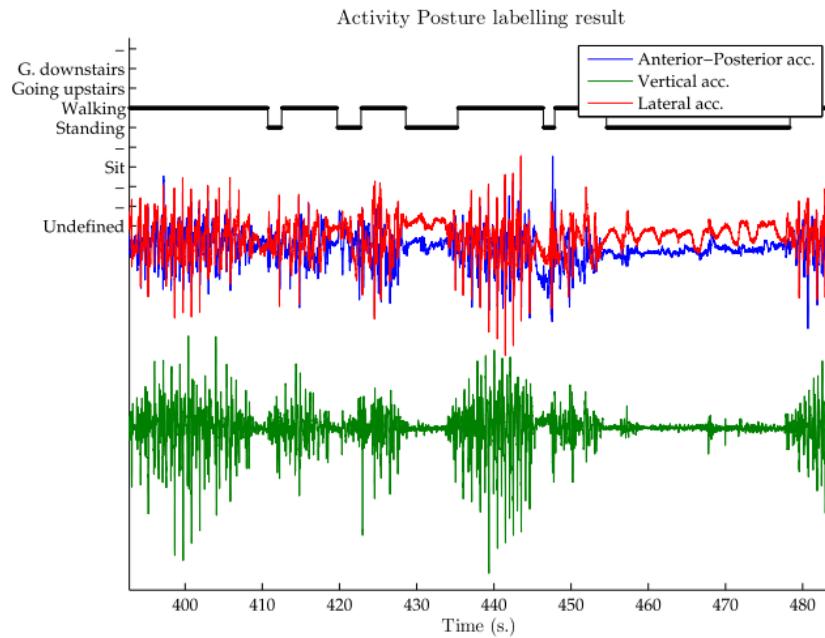
Activity/Posture:
Sit
ON-OFF:
Clear OFF state
Dyskinesia:
Without Dysk
FoG:

Tremor:
Without tremor
Bradykinesia:
No bradykinesia
Festination:

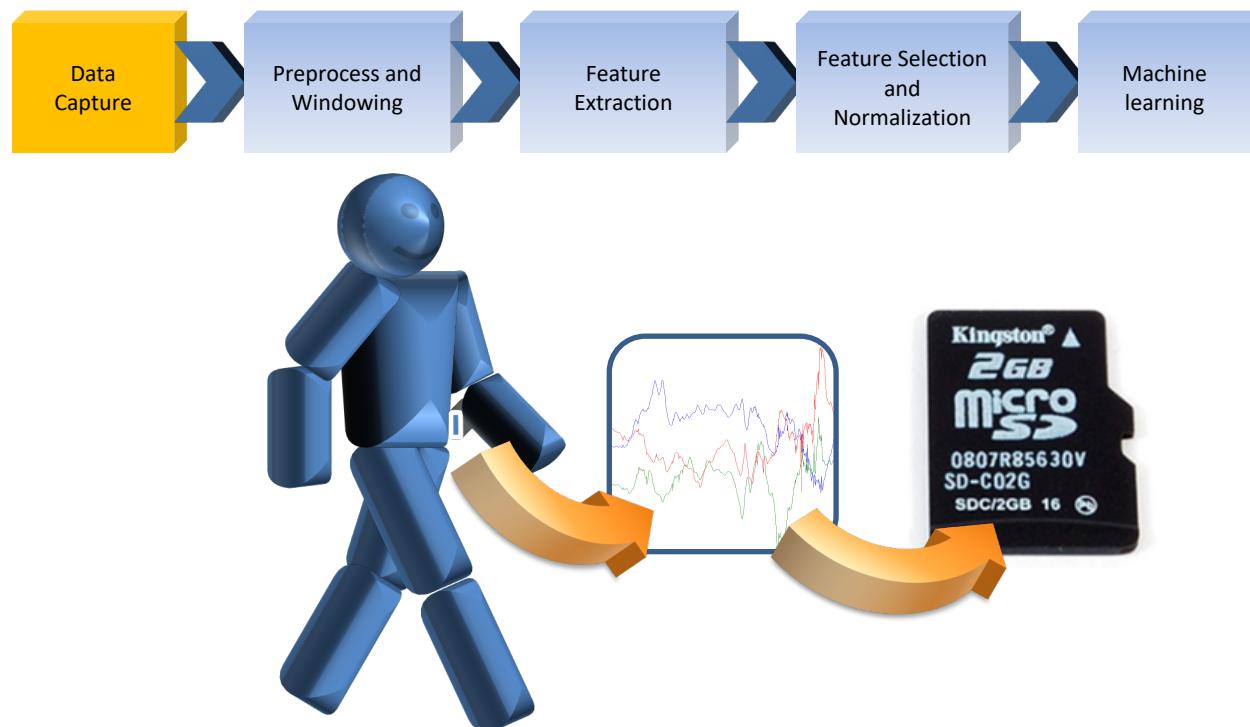
Falls:
No fall
Walking aids:
-



Machine learning



Machine learning



Machine learning



$$(x'_k, \hat{y}'_k, \dots, z'_k) = (\hat{x}_k, y_k, z_k) \cdot C_k$$

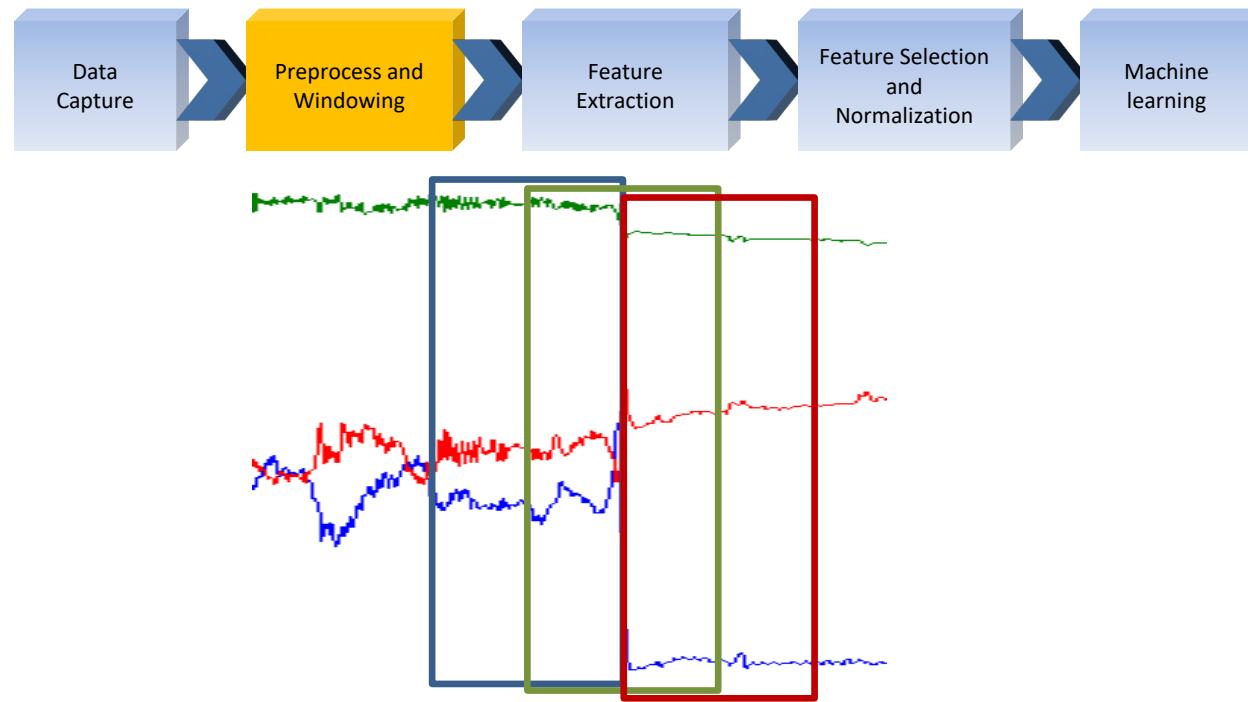
Acquired data Calibration matrix Calibrated data

k is a (accelerometer), g (gyroscope), or m (magnetometer)

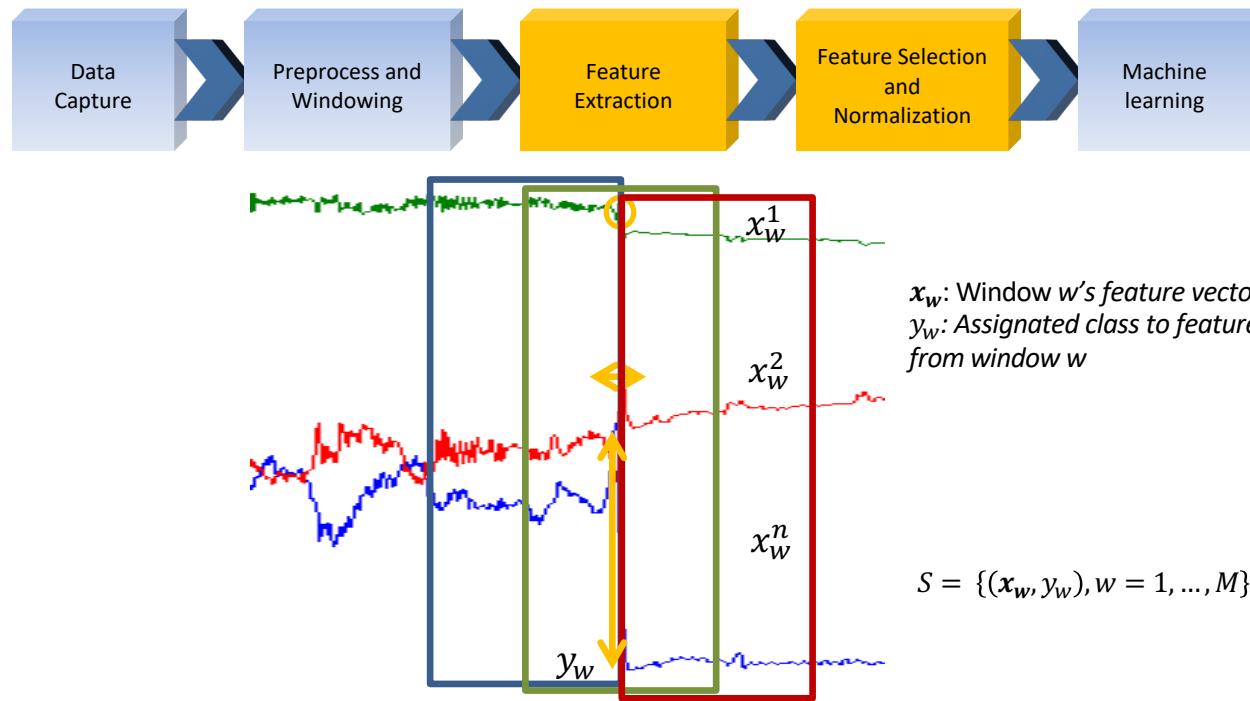
This equation shows the calibration process. It takes acquired data (\hat{x}_k, y_k, z_k) and multiplies it by a calibration matrix (C_k) to produce calibrated data ($x'_k, \hat{y}'_k, \dots, z'_k$). Orange arrows point from the labels to their respective components in the equation.

$$C_k = (L_k)(S_k)^T [(S_k)(S_k)^T]^{-1}$$

Machine learning



Machine learning



Machine learning



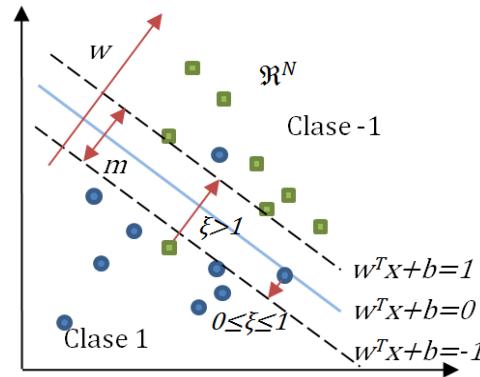
Support Vector
Machines

Random Forest

Tree Classifier

Neural
Networks

•
•
•



$$\text{minimizar } \left\{ \frac{1}{2} \|w\|^2 + C^* \sum_{i=1}^l \xi_i \right\}$$

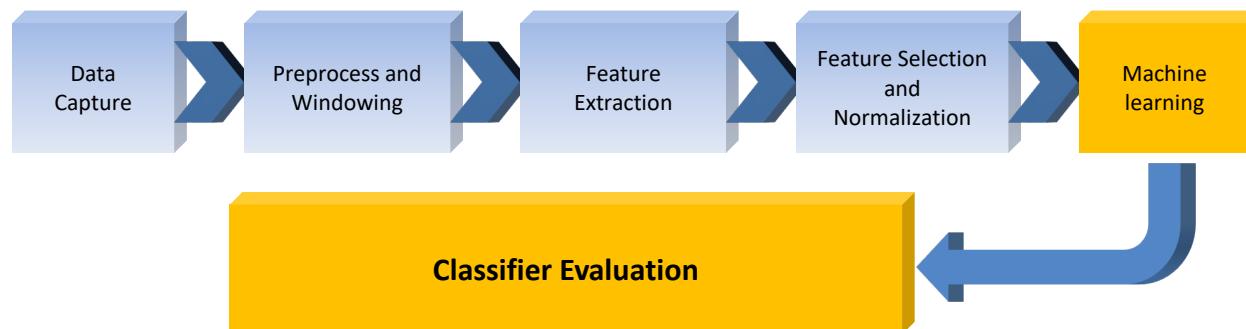
$$\text{Sujeto a: } y_i(w \cdot \varphi(x_i) + b) \geq 1 - \xi_i, \forall i$$

$$\xi_i \geq 0, \forall i$$

$$C^* = C_1 = C \cdot \rho_{-1} \text{ si } y_i = 1$$

$$C^* = C_{-1} = C \cdot \rho_1 \text{ si } y_i = -1$$

Machine learning



$$\text{Sensitivity} = \frac{TP}{TP+FN}$$

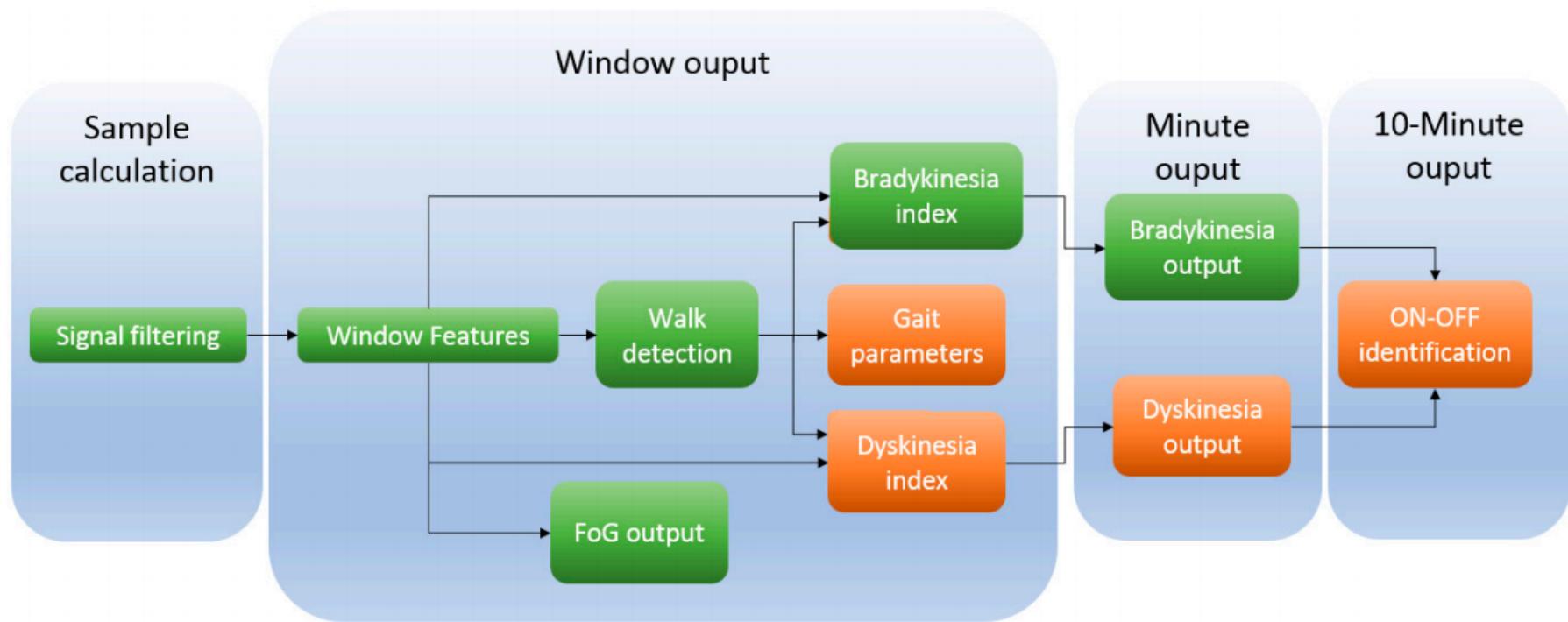
$$\text{Specificity} = \frac{TN}{TN+FP}$$

	Goal Class	No-Goal Class
Positive Test	TP	FP
Negative Test	FN	TN

Sensitivity (also called the **true positive rate**) measures the proportion of actual positives that are correctly identified as such.

Specificity (also called the **true negative rate**) measures the proportion of actual negatives that are correctly identified as such

PD: motor symptoms evaluation



Algorithms validation

ORIGINAL RESEARCH
published: 01 September 2017
doi: 10.3389/fneur.2017.00431

Analysis of Correlation between an Accelerometer-Based Algorithm for Detecting Parkinsonian Gait and UPDRS Subscales

Alejandro Rodríguez-Molinero^{1,2*}, Albert Samá^{3,4}, Carlos Pérez-López^{2,4}, Daniel Rodríguez-Martín⁵, Sheila Alcaine⁶, Berta Mestre⁶, Paola Quispe⁶, Benedetta Giuliani⁶, Gabriel Vainstein⁷, Patrick Browne⁸, Dean Sweeney⁹, J. Manuel Moreno Arostegui^{8,9}, Angels Bayés⁹, Hadas Lewy¹⁰, Alberto Costa^{1,10}, Roberta Annicchiarico¹⁰, Timothy Counihan¹¹, Gearóid O. Laighin¹² and Joan Cabestany^{2,4}

OPEN ACCESS

JMIR MHEALTH AND UHEALTH

Rodríguez-Molinero et al

Original Paper

Validation of a Portable Device for Mapping Motor and Gait Disturbances in Parkinson's Disease

Alejandro Rodríguez-Molinero^{1,2*}, MD, PhD; Albert Samá^{3,4}, PhD; David A Pérez-Martínez⁴, MD, PhD; Carlos Pérez López², MSC; Jaume Romagosa³, BSc; Àngels Bayés⁹, PhD; Pilar Sanz⁶, MD, PhD; Matilde Calopé⁷, MD, PhD; César Gálvez-Barrón⁸, MD; Eva de Mingo⁸, BN; Daniel Rodríguez Martín³, PhD; Natalia Gonzalo⁸, NURSE AID; Francesc Formiga⁹, MD, PhD; Joan Cabestany³, PhD; Andreu Català³, PhD

JMIR REHABILITATION AND ASSISTIVE TECHNOLOGIES

Rodríguez-Molinero et al

Original Paper

A Kinematic Sensor and Algorithm to Detect Motor Fluctuations in Parkinson Disease: Validation Study Under Real Conditions of Use

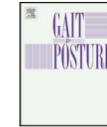
Alejandro Rodríguez-Molinero¹, MD, PhD; Carlos Pérez-López^{2,3}, PhD; Albert Samá^{2,3}, PhD; Eva de Mingo⁴, RN; Daniel Rodríguez-Martín², PhD; Jorge Hernández-Vara⁵, MD, PhD; Àngels Bayés⁶, MD, PhD; Alfons Moral⁷, MD, PhD; Ramiro Álvarez⁸, MD, PhD; David A Pérez-Martínez⁹, MD, PhD; Andreu Català^{2,3}, PhD



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Full length article

A “HOLTER” for Parkinson’s disease: Validation of the ability to detect on-off states using the REMPARK system

Àngels Bayés^{a,b*}, Albert Samá^b, Anna Prats^{c,k}, Carlos Pérez-López^b, Maricruz Crespo-Maraver^{b,c}, Juan Manuel Moreno^b, Sheila Alcaine^a, Alejandro Rodríguez-Molinero^{d,e,f}, Berta Mestre^a, Paola Quispe^a, Ana Correia da Barros^g, Rui Castro^g, Alberto Costa^h, Roberta Annicchiaricoⁱ, Patrick Browne^j, Tim Counihan^{e,k}, Hadas Lewy^j, Gabriel Vainstein^j, Leo R. Quinlan^{e,m}, Dean Sweeney^{e,n}, Gearóid ÓLaighin^{e,m}, Jordi Joan Cabestany^b



SCIENTIFIC
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nature research

OPEN

Estimating dyskinesia severity in Parkinson's disease by using a waist-worn sensor: concurrent validity study

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Alejandro Rodríguez-Molinero^{1,2*}, Carlos Pérez-López^{3,4}, Albert Samá^{3,4}, Daniel Rodríguez-Martín^{1,4}, Sheila Alcaine⁵, Berta Mestre⁶, Paola Quispe⁶, Benedetta Giuliani⁶, Gabriel Vainstein⁷, Patrick Browne^{8,10,11}, Dean Sweeney², Leo R. Quinlan^{1,2}, J. Manuel Moreno Arostegui^{3,4}, Àngels Bayés⁹, Hadas Lewy¹⁰, Alberto Costa^{1,2}, Roberta Annicchiarico¹⁰, Timothy Counihan¹¹, Gearóid O. Laighin¹², Joan Cabestany^{2,4}

PD motor symptoms evaluation: some results

SYMPTOM	Sensitivity	Specificity
Bradykinesia	88%	89%
Dyskinesia	93%	95%
FoG	88,1%	80,1%
ON/OFF	90%	91%

Step detection accuracy = 97%

Sensitivity (also called the **true positive rate**) measures the proportion of actual positives that are correctly identified as such.

Specificity (also called the **true negative rate**) measures the proportion of actual negatives that are correctly identified as such

STAT-ON: clinical evaluation status

Activity	Character of the experience	Title of the experience	Main responsible	Funding scenario
1	Pilots for clinical validation of STAT-ON™	Comparison between classical visits and STAT-ON™ information	Consorci Sanitari Penedès-Garraf	MoMoPa-EC project. FIS project funded by ISCIII in Spain With the support of Abbvie
2		Clinical Use experience	UParkinson. Quirón Teknon and Hospital Moisès Brogi	Internal activity
3		Practical use and general opinion of neurologists	COPPADIS initiative	COPPADIS
4		Therapeutic medication adjustment by comparing different information	Hospital Germans Trias i Pujol	Internal, with the possible participation of Abbott
5		Therapy enhancement to prevent falls due to PD symptoms in PD patients	Hospital Universitario de Burgos	FIS project funded by ISCIII in Spain
6		User experience using STAT-ON™	Air-Liquide - Orkyn in France	Internal
7		Deep Brain Stimulation experience	Hospital Cruces - Bilbao (Spain) Osakidetza	Internal
8	Formal running projects	Integration into a large-scale system and analysis of data	Gatekeeper project (H2020 initiative) H2020-SC1-FA-DTS-2018-2020-85722	EU
9		Platform design to adapt information to hospital systems	REVEL-PARK action	ACTIVAGE project - EU
10	Independent actions	Other actions	A number of initiatives (private and corporative) including the free use of STAT-ON™ for a limited time	

Amazing performance at @TecnoSEN (Nov.2019) event from Dra. Bayès presenting results from 40 patients using STAT-ON.

Some conclusions from the study:

- Hauser diaries, is this the end?
- STAT-ON has more sensitivity to detect Motor Symptoms
- It has helped to view the general state of the patient.
- STAT-ON can detect the beginning of “wearing-off”.
- It detects patients with initial or mild dyskinesias.
- The system has very good usability
- It is useful to know when FoG episodes appear (ON, OFF or both states).
- With the analysis of the reports, it speeds up the visit of the patient at doctor’s office.
- The STAT-ON helps to improves QoL of the patient and helps to empower the patient.
- The sensor perceives less % OFF (the sensor cannot detect OFF when the patient is still).

Novembre de 2019 a Sevilla



Sociedad Española de Neurología
Fundada en 1949



Some additional conclusions:

- eHealth is a very challenging concept, opening the doors to very different view of the relationship between doctors and patients. **STAT-ON should be part of it.**
- **IoT** (Interner of Things), with the technological deployment, should be able to promote the use and diffusion of eHealth practices.
- AI is an embedded concept that can help in many aspects:
 - Big Data analysis
 - Recommend and suggest actions according personal needs
 - Stablish alarms to be launched in the presence of some circumstances
 - Suggest actions to the doctors (not to take automatic actions!!)

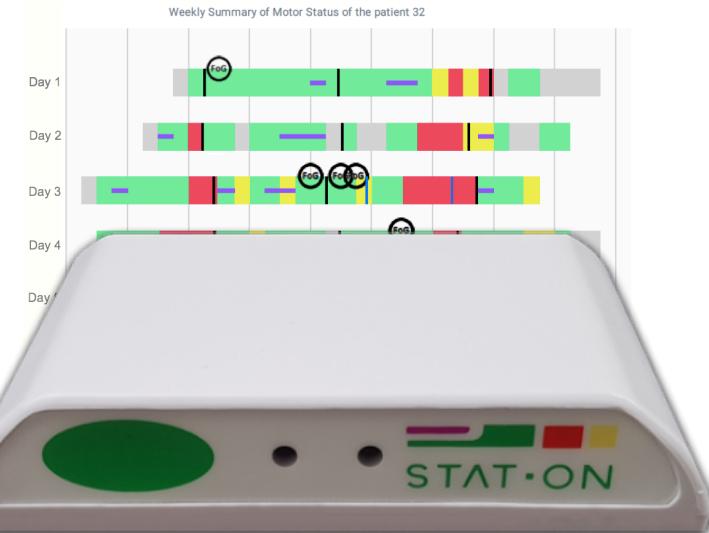
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Questions?