

**LA MEDECINE PERSONNALISEE GRACE AU
NUMERIQUE ».**
*A l'ère du post-génome d'une côte ouest à l'autre!
« Heureux qui comme Ulysse à fait un beau voyage »*



Rotary Club Toulouse - Le Belvédère

Prof. Pierre-Antoine Gourraud

UCSF, Neurology Department, San Francisco, USA. & UMR Inserm 1064 -University of Nantes , France &
PHU 11 Pôle Hospitalo-Universitaire 11 : Santé Publique, Nantes University Hospitals, France



PLAN

- 1- Parcours scientifique "d'une côte ouest a l'autre"
- 2- La recherche médicale à l'ère numérique
- 3- Mon "odyssée" américaine en 5 phrases

UN PARCOURS

Curriculum Vitae – Parcours Académique

- **Emploi Actuel:**

- Professeur des universités-praticien Hospitalier Université de Nantes

Ancien Associate Professeur In Residence, Step 3 WOS Neurology School of Medicine; University of California, San Francisco

- **Fonction et Service**

- 1999-2006 : Elève Normalien – Moniteur Allocation Couplée
- 2006-2008 : Assistant Hospitalo-Universitaire, CHU-Toulouse
- 2008 : Création de Methodomics SARL
- 2009-2011 : Post-doc UCSF, USA
- 2011- 2015 : Enseignant-chercheur UCSF, USA

- **Cursus Universitaire**

1999 – 2001	UFR Sciences de la vie, Université Lyon-I	Maîtrise	Physiologie – Biol. Cellulaire
1999 – 2003	École Normale Supérieure, Université Lyon-I	Normalien	Biologie
2002 – 2005	Doctorat d'Université, Université-Toulouse III	Doctorat	Biologie
2004 – 2006	Licence de Philosophie, Univ. de Toulouse (I.C.T.)	Licence	Philosophie
2007 – 2010	DU de Pédagogie Médicale, Univ. Toulouse III	DU	Pédagogie médicale
2013 – 2014	Habilitation à Diriger des Recherches, Univ. de Nantes	HDR	Médecine





LA RECHERCHE

Introduction

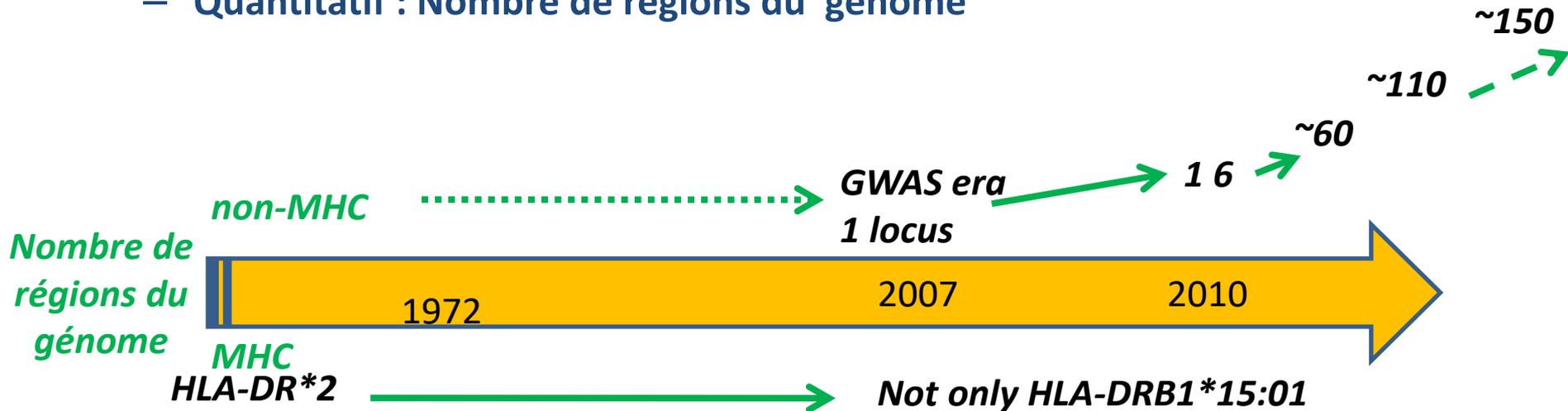
- **La recherche, des chercheurs**
 - Un parcours “collectif et personnel”
- **Des données pour mieux comprendre les maladies complexes** comme la Sclérose en Plaques
 - La variabilité de la maladie
 - 1 - Génétique
 - 2 - Imagerie cérébrale
 - 3 - “Démocratiser” l'accès aux données grâce au numérique
 - 4- Objets connectés

1 – Génétique de la Sclérose en plaques



Historique de la génétique de la Sclérose en plaques

- **Avertissement sur :**
 - Le rôle limité mais réel de la génétique dans l'explication de la maladie
- **Explosion des connaissances en génétique de la SEP**
 - Quantitatif : Nombre de régions du génome



“Big data” La génétique de la SEP

Beaucoup d'individus

MS Cases

Controls

S Single

N Nucleotide

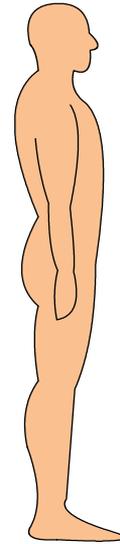
P Polymorphism

Des associations statistiques en population

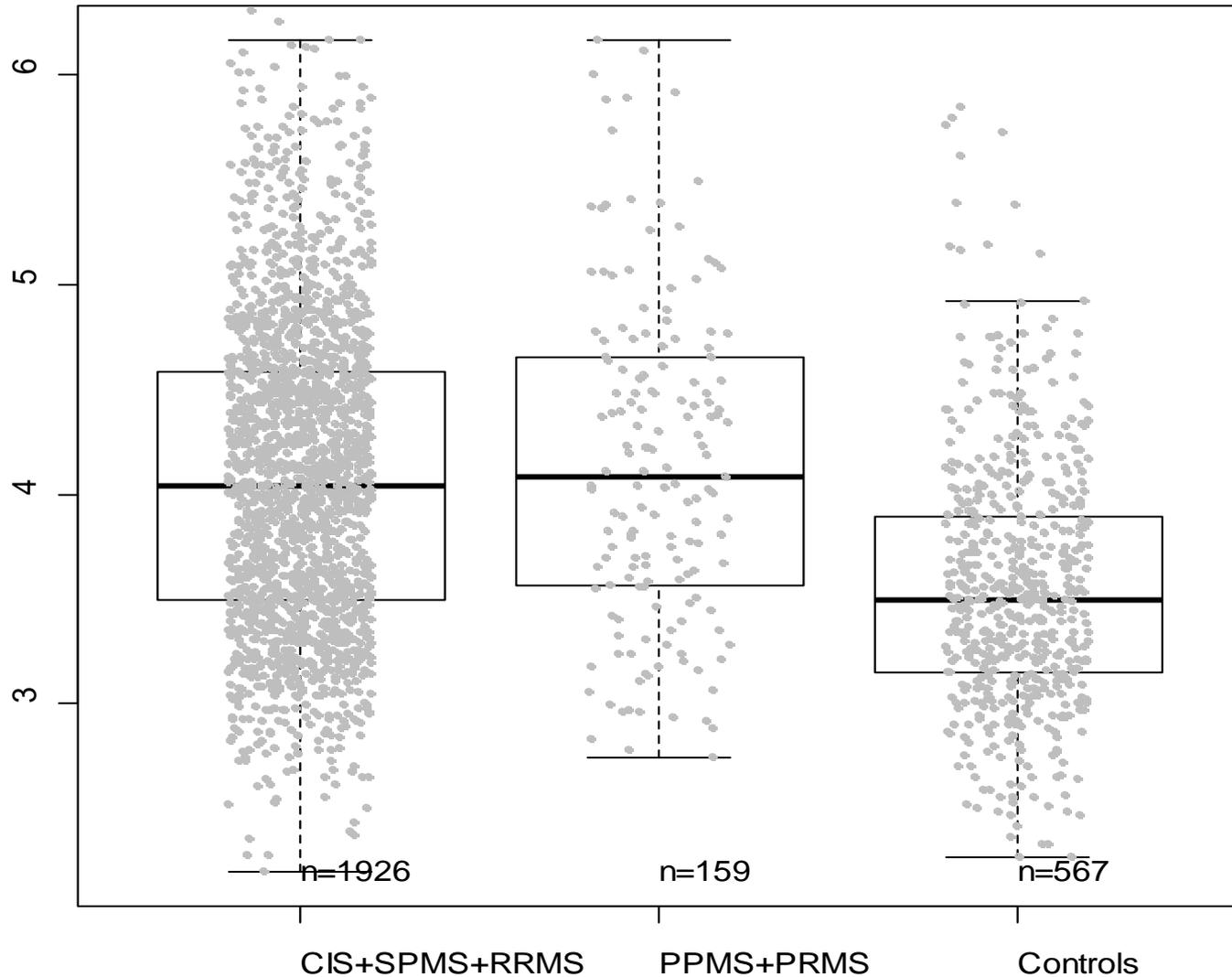
Vers un profil Génétique individuel

MS Cases

Controls



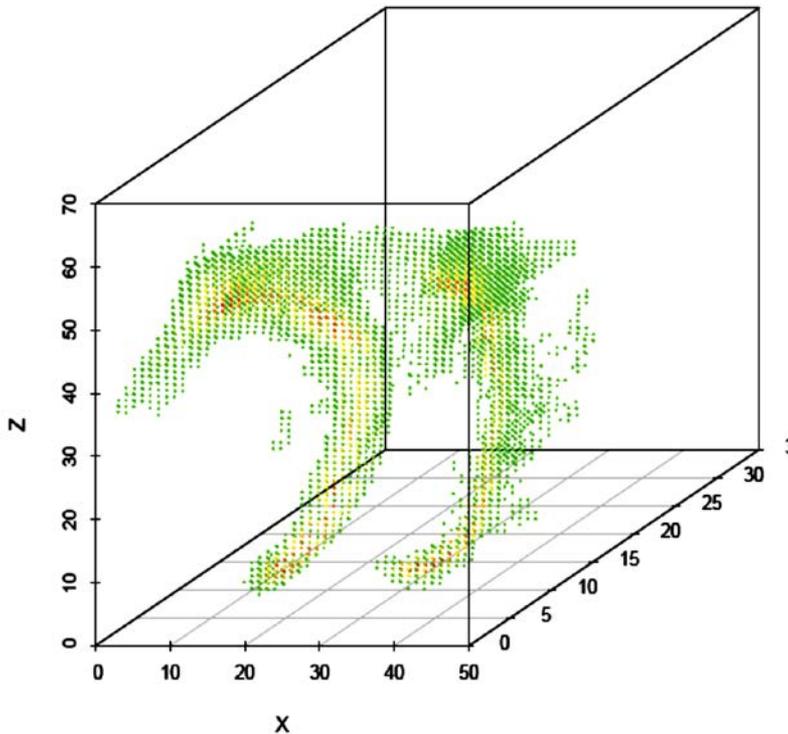
La Variabilité au cœur du vivant...



2 –Imagerie, la place de la technique et des données

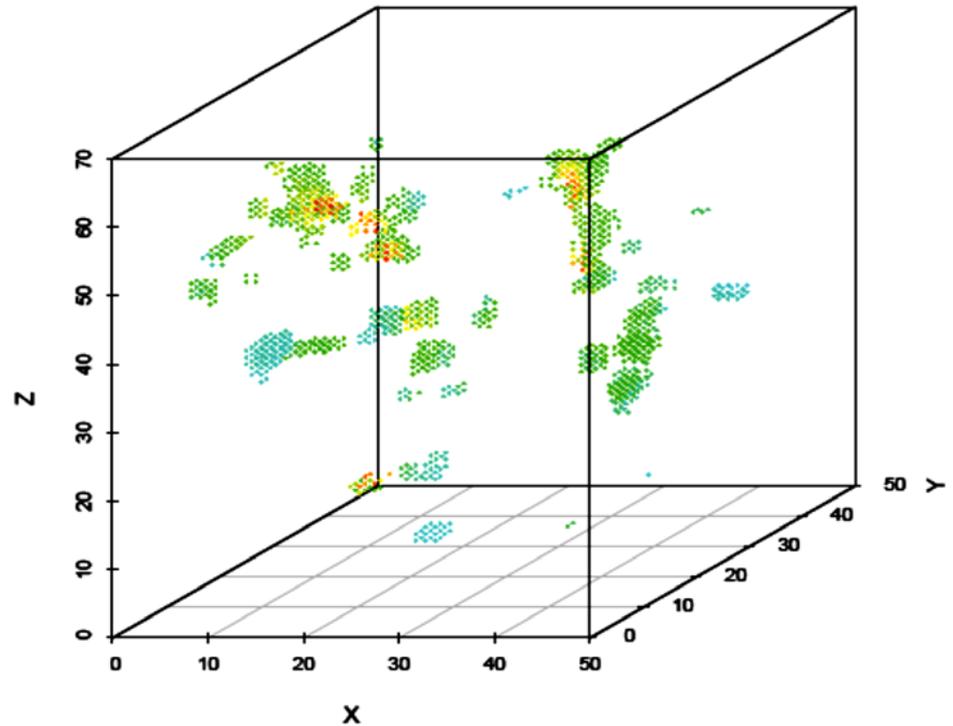
Retourner à l'individu

Niveau de Population



Une carte en moyenne

Niveau de l'individu



Un individu "dans le contexte de données en population"



3 – Médecine de précision pour la SEP



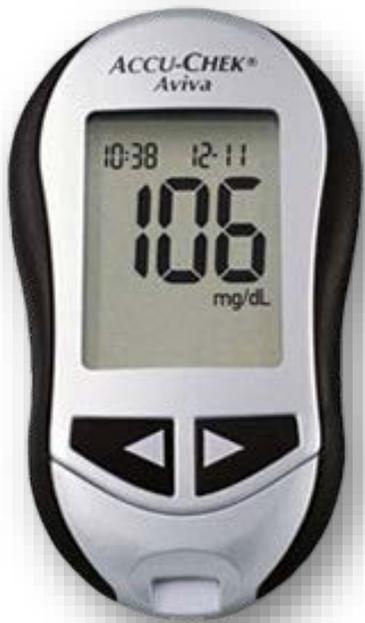
Expérience et
mémorisation







Des outils



ECG



Séquençage
des tumeurs

Une
opportunité

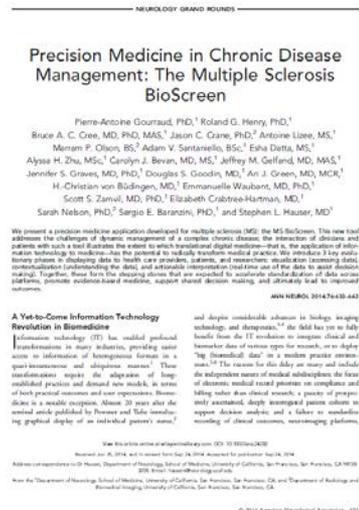


3- Réalité dans la Sclérose en Plaques

- Une application “Ipad” le MS Bioscreen – “Precision” → “Personalized” Medicine

Comment le numérique va nous permettre de mieux comprendre et traiter les maladies chroniques ?

*Gourraud et al. 2014 “Precision medicine in chronic disease management: the MS BioScreen
Annals of Neurology Vol 76, Issue 5, 633–642, Nov 2014*

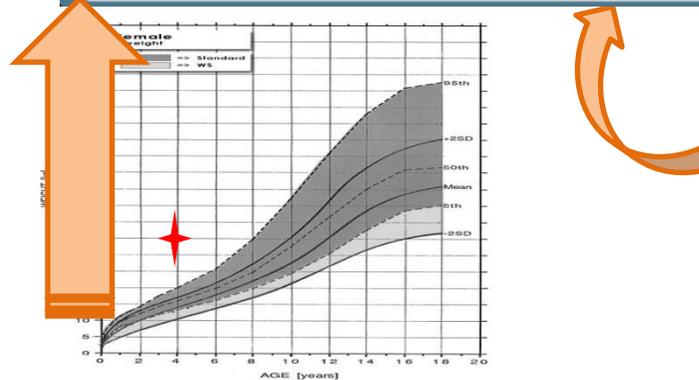
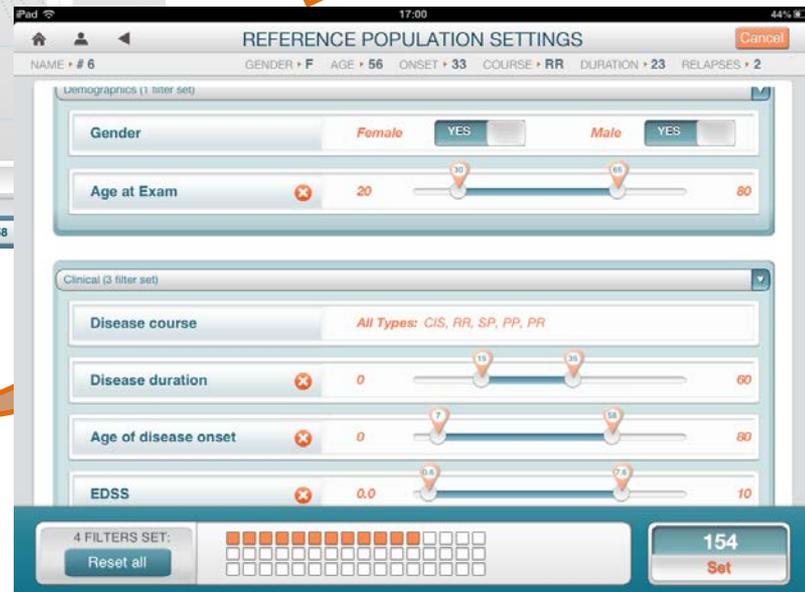


De la PRECISION à la PERSONNALISATION

Utiliser les données pour construire les « courbes de croissance » du XXIst siècle



Une « courbe de croissance électronique »
Ex EDSS, Disability score - disease duration



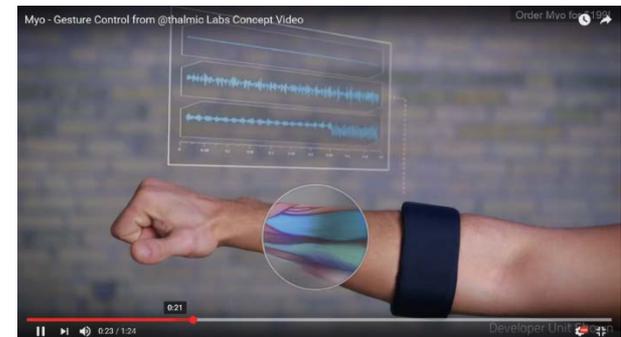
Traditionnelle « Courbe de croissance » Ex: Age - poids

Capacité de modifier la référence

4- LA TRANSFORMATION DIGITALE DE LA SANTÉ – UN EXEMPLE DES OPPORTUNITÉS

Surface au service de la collecte de données

- Examen Neurologique traditionnel
 - Observation : pratique de l'art de la médecine
 - Test de Coordination : système moteur & sensoriel
 - Lésions cérébelleuses et/ou vestibulaire
- **Present** : Digitalisation des pratiques



Electro-Myographe de Surface au service de la collecte de données

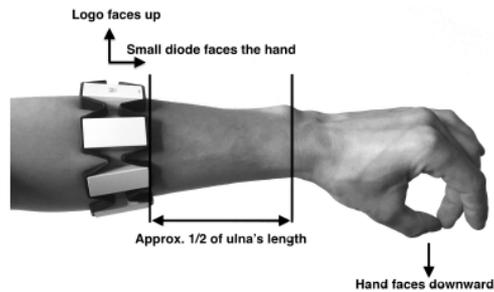


Fig. 2. Armband positioning on the forearm, example shown for finger tapping test.

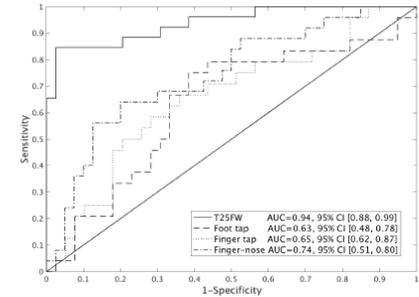
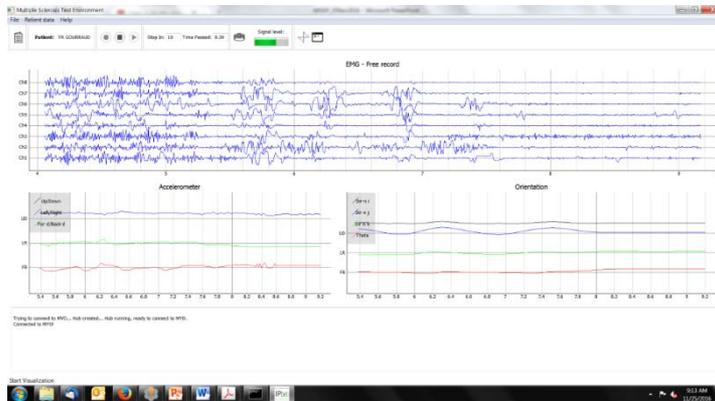


Fig. 4. ROC curves for four motor function tests, T25FW stands for timed 25 foot walk.



- **Nouvelles données nouveaux Outils :**
 - Algorithme d'intelligence artificielle"
 - Traitements des données à grande échelle
 - Classement des patients
- **Modification de notre regard sur la sclérose en plaques**
 - Analyse de la marche

Exemple : Objet Connecté

- La vision d'un progressiste-traditionaliste
 - Passer a la vitesse supérieure – être “data-savy”
 - Ancrage traditionnellement disciplinaire
- La révolution des TIC crée des opportunités de collecte de données a bas coûts
 - acquisition de données Active (avec la participation active du patient)
 - acquisition de données Passive (sans requérir la participation active du patient)
 - Opportunité de transformation
- Traditionnaliste : Qualité des données
 - Signal / Noise
- Traditionaliste : biais et représentativité
 - Une nouvelle épidémiologie des données massives et non intentionnelles

SVM-based Tool to Detect Patients with Multiple Sclerosis Using a Commercial EMG Sensor

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Abstract—Multiple sclerosis (MS) is a major auto-immune disease that is the leading cause of non-traumatic impairment of the central nervous system (CNS) in young adults. Successful treatment of MS patients depends on accurate tools for both the MS diagnosis and the disability progression. In current and upcoming studies the authors aim to explore the capabilities of applying a commercial electromyographic and inertial sensor (MYO Armband by Thalmic Labs Inc.), coupled with a multichannel signal processing tool, to standard neurological examination. In this pilot study we formulate a two-class “healthy control” - “having MS” classification problem. A dataset of electromyographic signals and inertial sensor measurements from 71 individuals (31 MS patients and 40 healthy controls) was acquired during standard neurological examination routine. Temporal and spectral features of the signals were extracted in order to train and validate a classification model. Finally, a Support Vector Machine classifier was obtained giving AUROC = 0.94, 95% CI = [0.88, 0.99] and verified using five-fold cross-validation. We propose a set of signal descriptors that correlate with objective components of the neurological examination. The proposed signal acquisition and processing technique, being easy to integrate into the traditional neurological exam, may have high potential for aiding in diagnosing MS and quantifying its progression.

1. INTRODUCTION

Multiple sclerosis (MS) is a chronic debilitating neurological disorder that mainly affects young individuals aged between 20 and 40. As a cause of neurologic disability MS is second only to trauma, having its prevalence estimated at 2.5 million worldwide in 2014. The actual cause of MS is yet to be identified, but a complex interaction between genetic and environmental factors contributes to the risk. To date, there is no reliable method to predict MS onset or progression. Successful managing of the symptoms and attacks for MS patients highly depends on an accurate and timely diagnosis as well as the possibility to measure disability progression.

Diagnostic criteria for multiple sclerosis include a number of clinical and paraclinical laboratory assessments [1], [2]; cerebrospinal fluid analysis, study of visual evoked potentials, electromyography analysis, neuroimaging and motor/sensory/balance function tests. The latter involves various motor tasks to be accomplished by the subject: timed 25-foot

walk [3], 9-hole peg test, finger-to-nose test [4], heel-knee-shin test, finger tapping, foot tapping, etc.

The most common motor manifestations of MS are muscle fatigue, spasticity and tremor. Listed symptoms involve abnormal functioning of skeletal muscles and thus affect their activation patterns. In such cases, deviations may be revealed by analysis of limb trajectories and of involved muscles' electromyography (EMG). These measurements are proven to be efficient in different studies of MS progression [5]–[7]. Thus, an EMG recording along with the inertial measurement unit (IMU) data may aid to characterize presence and severity of MS.

Common MS diagnosis and progression study approaches, as those listed above, require specific equipment, procedures and clinical expertise. A lack of them may slow down or make the diagnosis impossible, which is a common case for low populated areas or developing countries. A possible way to overcome these difficulties is to apply a widespread cheap acquisition system, along with unified assessment protocol and automated decision-making. As such an acquisition system we propose the MYO armband (figure 1) developed and commercialised by Thalmic Labs Inc [8]. It comprises eight EMG channels and an IMU giving acceleration, orientation and rotation speed measurements in three axes. This device is wireless, cheap, easy to use, actively supported by community and can be shipped to any location.

MYO armband's default software is capable of recognising five different hand gestures, based on EMG. Also, IMU sensor provides a pointer control. In academic studies, this device was applied in sign language gesture recognition [9] and prosthetic control [10], [11]. Typical signal processing pipeline in these applications consists of the following steps: windowing, feature extraction, dimensionality reduction and classification using machine learning techniques [12], [13]. Such an approach may also be effective in an application to MS diagnostics since there is no strictly defined model of how MS affects surface EMG signals or limb trajectories. Other reasons to use machine learning techniques in this case are the dimensionality of the data and the fact that measurements

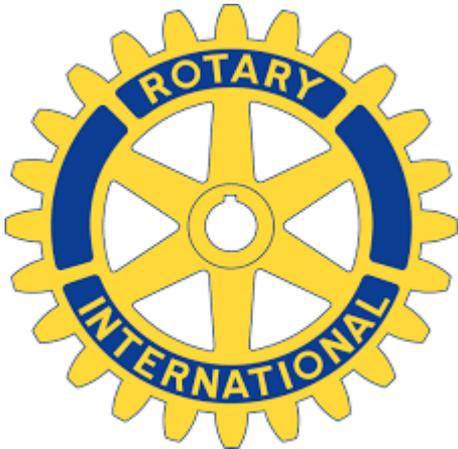
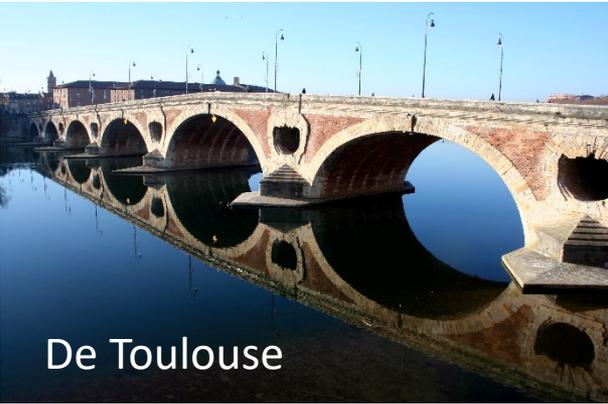
Quels enseignements dans ce projet ?

- Un abaissement formidable du cout de collecte des données
 - Des objets « connectés », des capteurs
- Au centre du développement du numérique la question des usages
 - Pas « disruptif »
 - Que faire de ces « données »? Est-ce qu'on en a trop?
 - Prolonge l'observation et la réflexion ne la remplace pas
- Penser un rapport aux objets techniques
 - Imaginer des opportunités des transformations
 - Etudier les usages
 - Evaluer les conséquences en santé

**5- LA FRANCE LES USA, LES VERTUS DU
VOYAGE – QUE RAMENER DANS SES
BAGGAGES?**

Heureux qui comme Ulysse ...

1. “What you deliver” – combinaison rapidité et confiance pragmatisme intégral
2. “Today is my last day” – flexibilité réciproque du marché du travail
3. “ You failed that is great “ – culture positive de l'échec
4. « sky is the limit » - American Dream
5. “ I want to do good” Le rôle des fondations – charity



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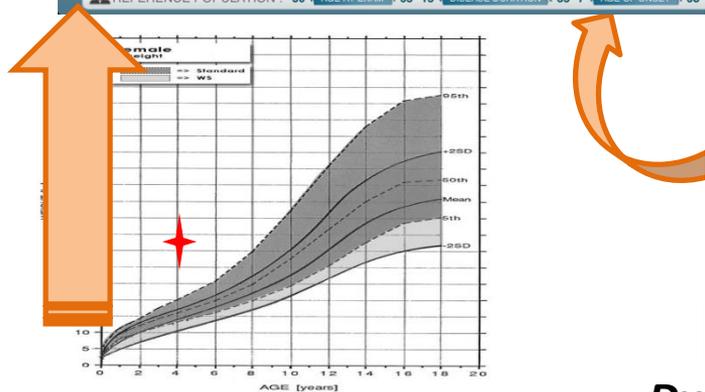
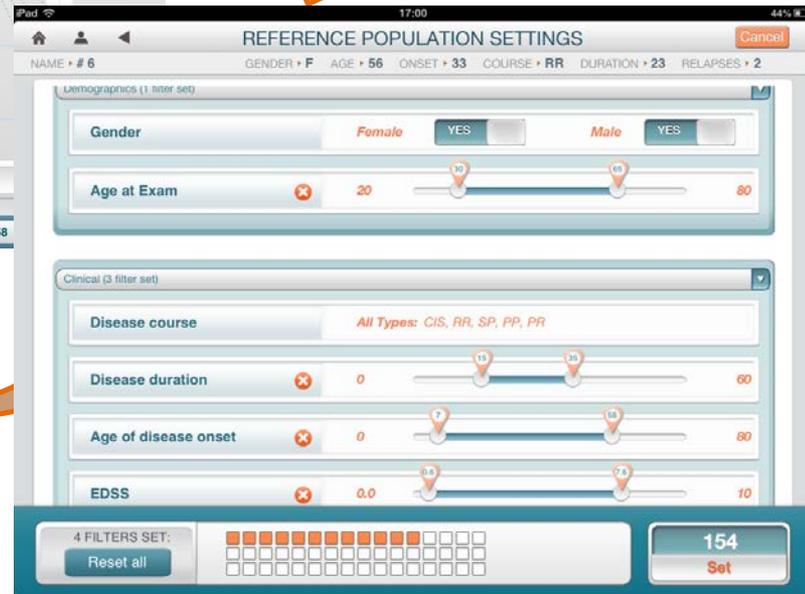


De la PRECISION a la PERSONALISATION

Utiliser les données pour construire les « courbes de croissance » du XXIst siècle



Electronic « growth chart for complex disease »
Ex EDSS, Disability score - disease duration



Traditional « Growth chart »
Ex: Age -weight

Dynamically tailored reference population empowering physicians & patients

3D serial MR Brain imaging

iPad 14:24 Not Charging

F, 35 yrs #54 IMAGING VISUALIZATION

0.0 6.0

Superior longitudinal fasciculus L

Exam:	1	2	3	4	5	6
AMW	4.4	5.0	5.1	5.1	5.1	5.4
CTZ	0.0	0.0	0.0	0.0	0.0	0.0

Displaying Exam: 5

Both Primary Overlay

Animate

Primary Image T2 Weighted

Overlay Image Apparent Myelin

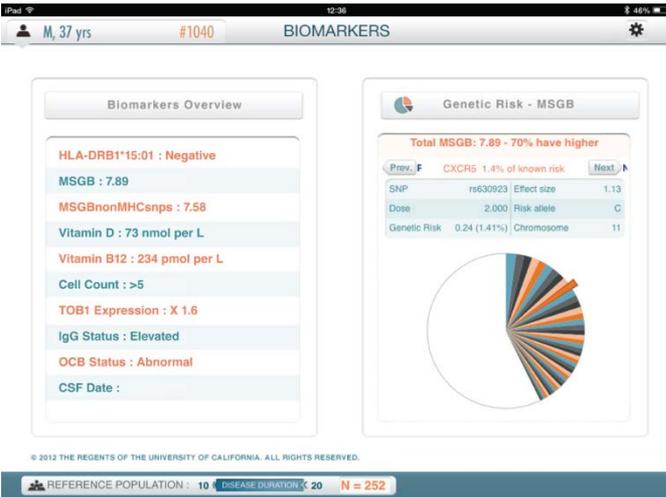
3D view

Copyright 2011-2013 The Regents of the University of California. All Rights Reserved.

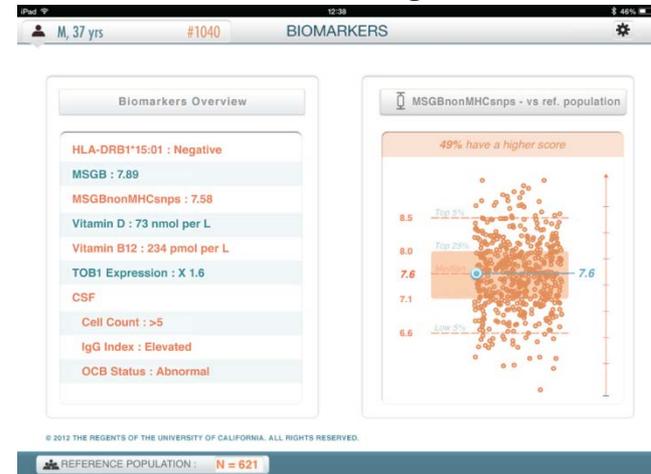
REFERENCE POPULATION : 9 DISEASE DURATION < 19 N = 275

Captures d'écran

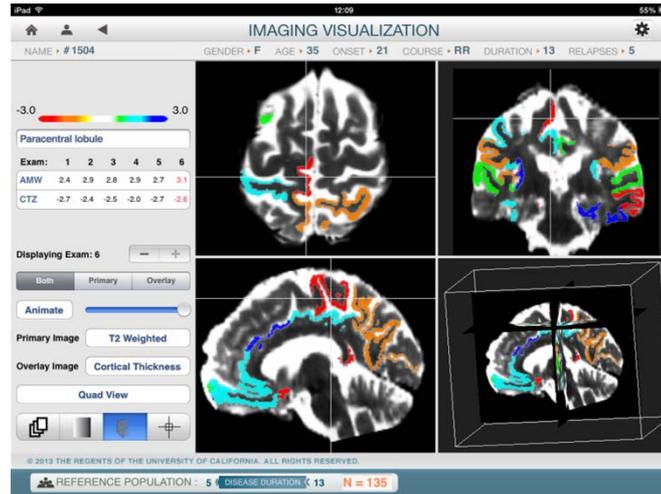
Gourraud et al 2014 Annals of Neurology



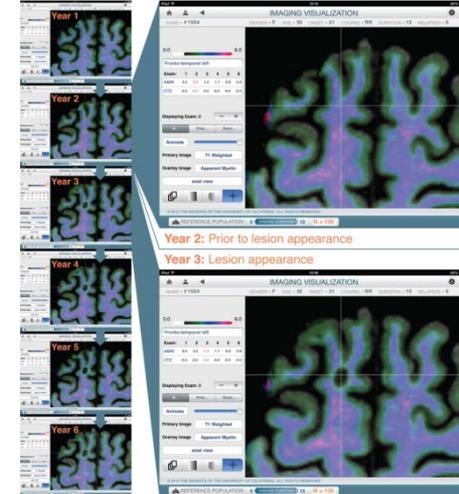
Biomarker and individual genetic risk load



Individual Genetic risk score in the context of reference population



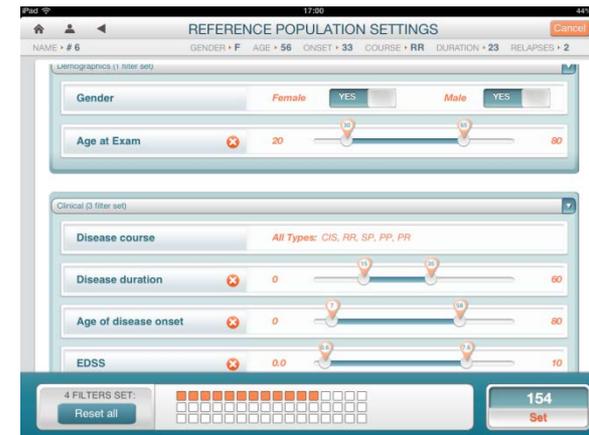
A four panel view of a T2 weighted brain MRI image with cortical thickness z-score overlay.



Longitudinal view of MRI data



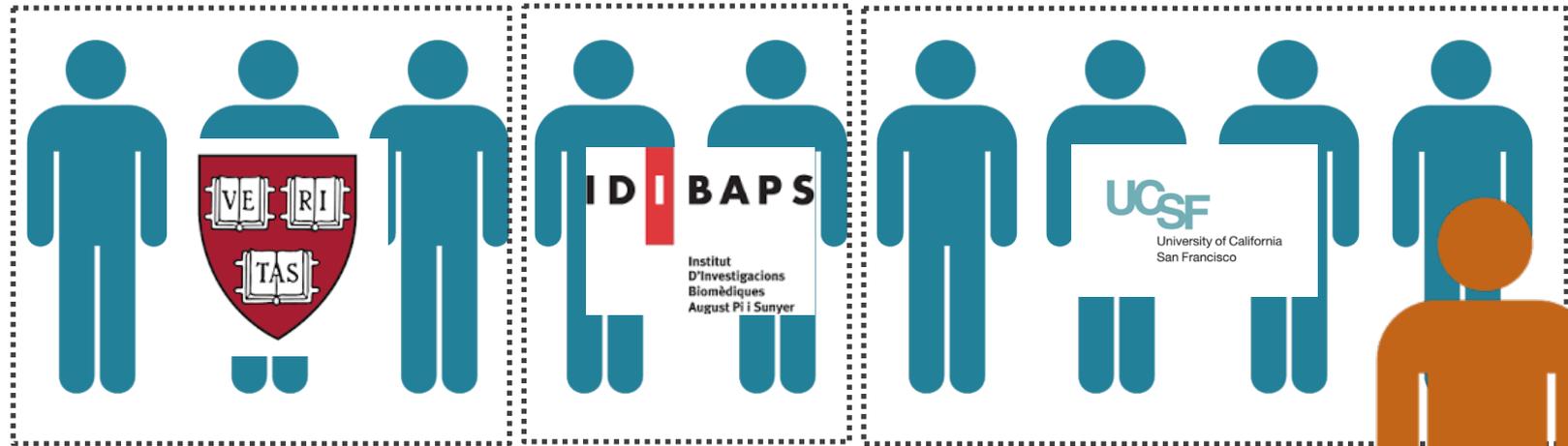
Individual Brain volume change in the context of reference population



Refinement of reference population selection

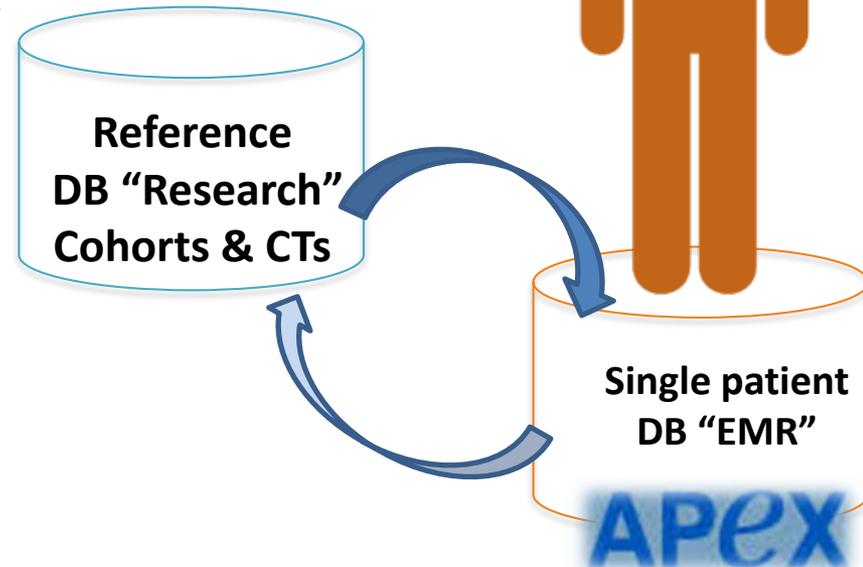
Direction 1 : Agrégation des données de référence

Rôle pivot des algorithmes de contextualisation



Reference datasets

- The **reference dataset** is called on to form the context to which the individual patient is compared.
- The richer, more robust the reference, the more **precise and informed** the contextualization.



Direction 2 : Déploiement

- Cercle Vertueux des données électroniques de sante-



From Clinic to research



Real- life Data at MS Clinic

Research reference data

EMR

APEX



From Research to Clinic

Create structured variables and standardization for key data entry to improve clinical care, quality improvement and also enable this kind of research –
“MS Vital Signs”

Use EMR-obtained data to regularly update, fuel and validate MS prediction algorithms, make this accessible to clinicians real-time