

Barriers to brain volume measurement in the real world

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Disclosure

Nothing to declare

Definition of measurement for a MR image.

Review of the most important barriers to the use of atrophy measurement in the real world:
list and possible solutions

Normative rates of atrophy: a lack for the clinical use of brain volume measurement in the
real world

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Quantification of a measure



Thing to be measured: TABLE

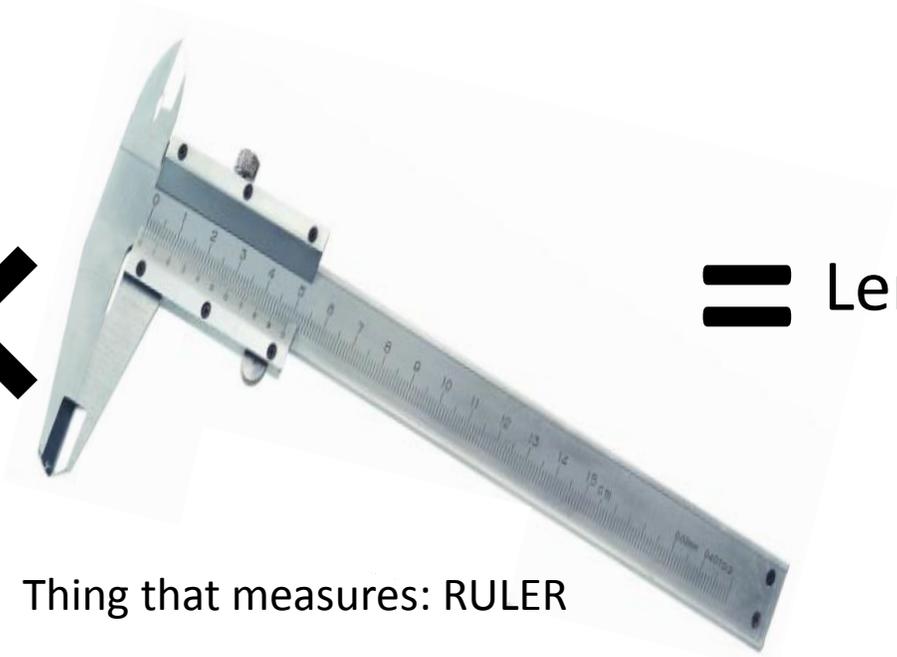


Thing that measures: RULER

Quantification of a measure



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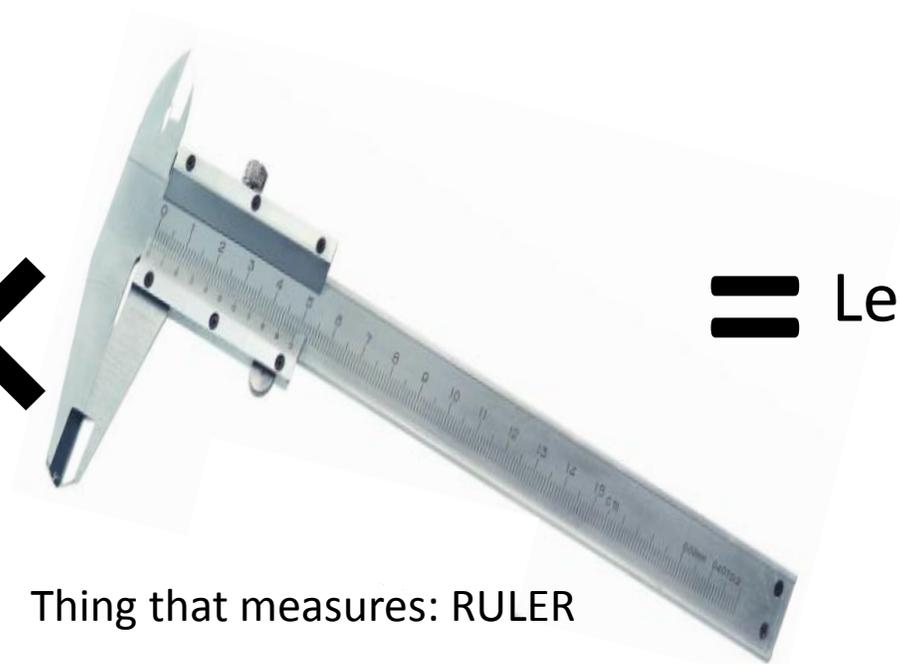
= Length of the table

Quantification of a measure



Thing to be measured: TABLE

Changes in length if measured in summer (bigger)
or in winter (smaller)



Thing that measures: RULER

The length will have the error of the scale.
Example: If the scale is 10 cm long, you cannot say if the table is 204
or 196 cm but only 200 cm \pm 5 cm

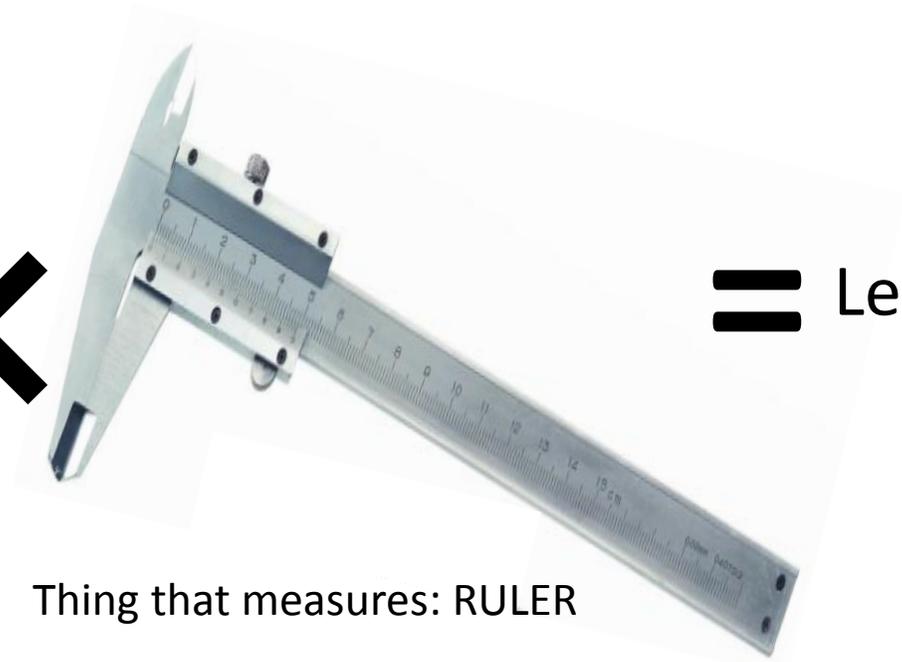
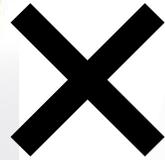
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= Length of the table

Measure of the length of table = True length + "Physiological" variation + error of the Ruler

Quantification of a measure for MR images



×



is it correct?

Quantification of a measure for MR images

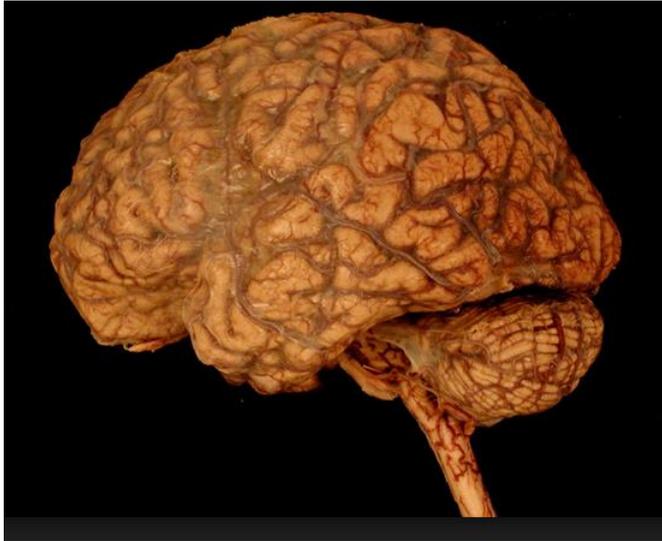


×



is it correct? NO

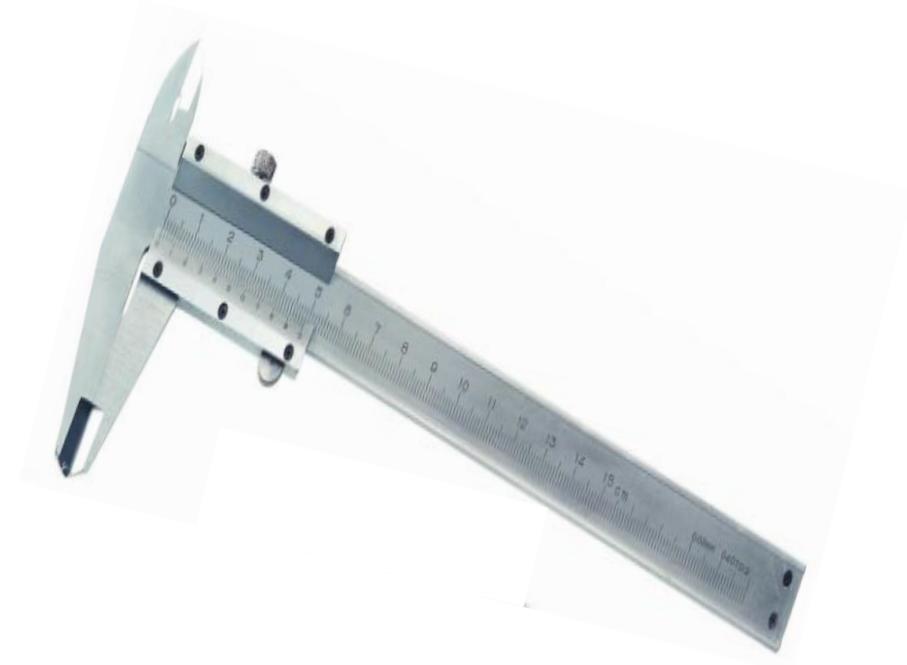
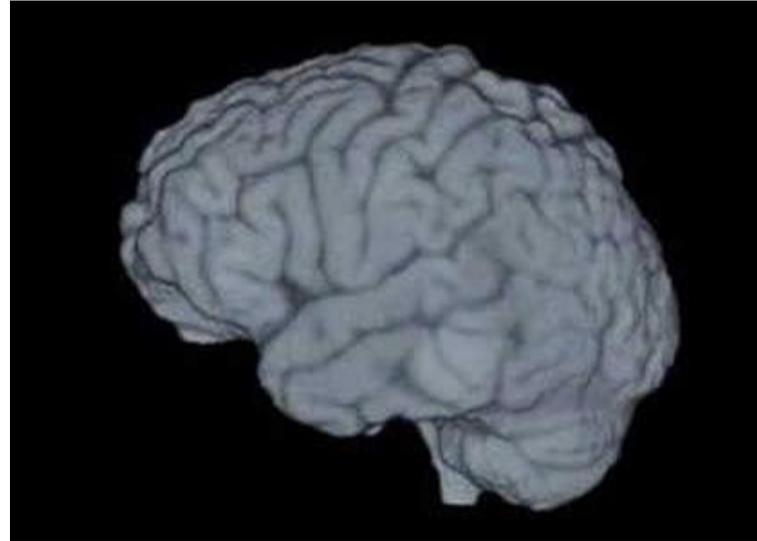
Quantification of a measure for MR images



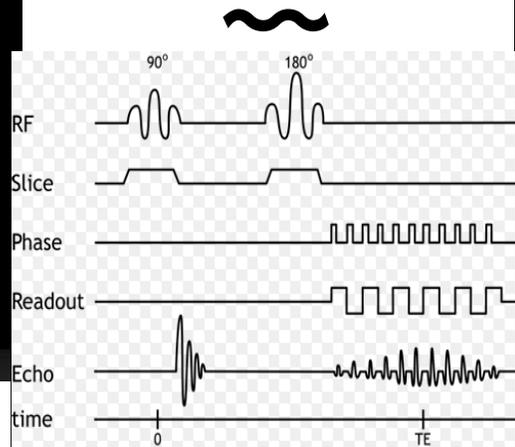
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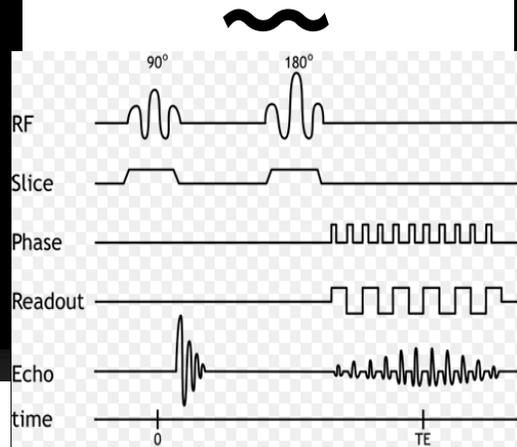
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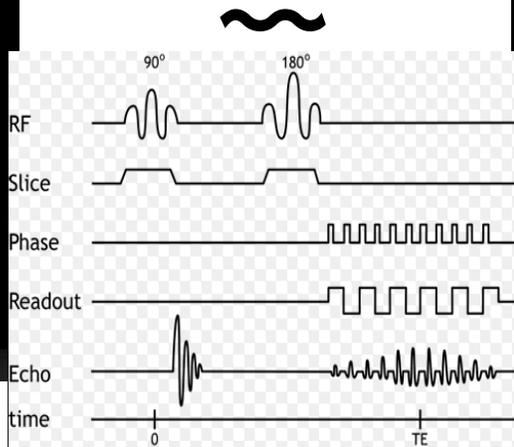


Quantification of a measure for MR images



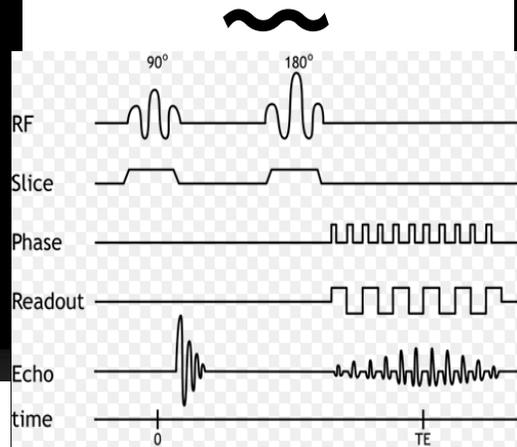
- Different field strength of the magnet

Quantification of a measure for MR images



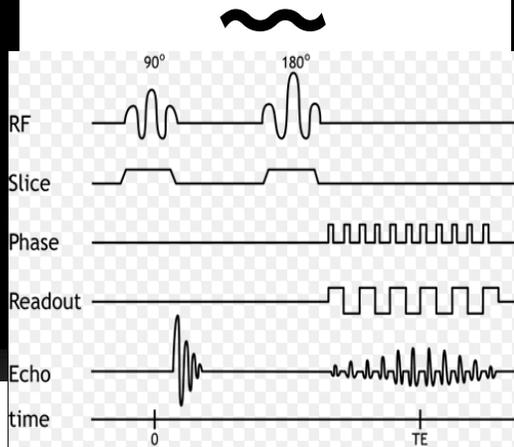
- Different field strength of the magnet
- Different hardware architecture of the magnet

Quantification of a measure for MR images



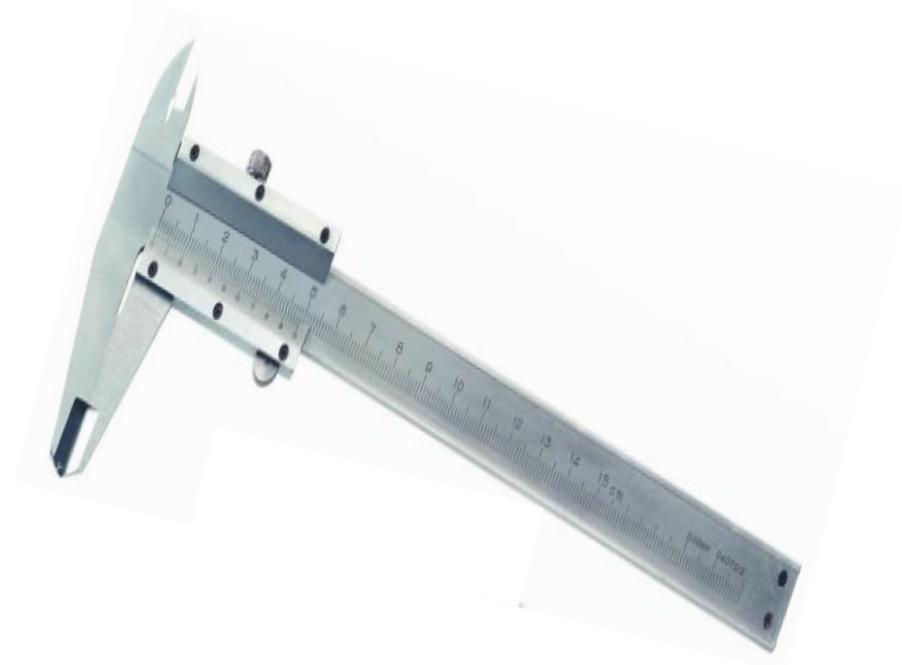
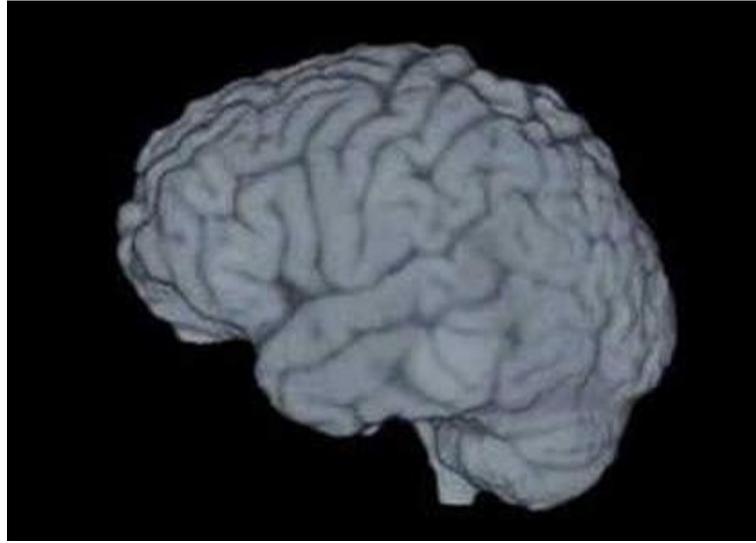
- Different field strength of the magnet
- Different hardware architecture of the magnet
- Different sequences

Quantification of a measure for MR images



- Different field strength of the magnet
- Different hardware architecture of the magnet
- Different sequences
- Within the same sequence, different acquisition parameters

Quantification of a measure for MR images



Quantification of a measure for MR images



Quantification of a measure for MR images



Quantification of a measure for MR images



- There is not a gold standard algorithm to analyse 3D images

Quantification of a measure for MR images



- There is not a gold standard algorithm to analyse 3D images
- Different methods provide different measures for the same analysed image.

Definition of measurement for a MR image.

Key point: the measurement is not “objective” but depends on:

- ❖ the MR setting
- ❖ the software used to analyse the images

Definition of measurement for a MR image.

Review of the most important barriers to the use of atrophy measurement in the real world:
list and possible solutions

Normative rates of atrophy: a lack for the clinical use of brain volume measurement in the real world

Barriers to the use of brain volume in real world

J Neurol (2013) 260:2458–2471

DOI 10.1007/s00415-012-6762-5

REVIEW

Recommendations to improve imaging and analysis of brain lesion load and atrophy in longitudinal studies of multiple sclerosis

**H. Vrenken · M. Jenkinson · M. A. Horsfield · M. Battaglini · R. A. van Schijndel ·
E. Rostrup · J. J. G. Geurts · E. Fisher · A. Zijdenbos · J. Ashburner ·
D. H. Miller · M. Filippi · F. Fazekas · M. Rovaris · A. Rovira · F. Barkhof ·
N. de Stefano · MAGNIMS Study Group**

Barriers to the use of brain volume in real world

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Brain Atrophy in Multiple Sclerosis Clinical Relevance and Technical Aspects

Jaume Sastre-Garriga, MD, PhD^{a,*}, Deborah Pareto, PhD^{b,c},
Alex Rovira, MD^{b,c}

KEYWORDS

- Multiple sclerosis
- MR imaging
- Brain atrophy
- Gray matter
- Biological confounding factors
- Disability

Barriers to the use of brain volume in real world

Change of Volume = True atrophy + Physiological variation + Software error

Barriers to the use of brain volume in real world

$$\begin{aligned} \text{Change of Volume} = & \text{ True atrophy} + \text{ Physiological variation} + \text{ Software error} \\ & + \\ & \text{ Variations due to the Image Acquisition} \end{aligned}$$

Barriers to the use of brain volume in real world

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Barriers to the use of brain volume in real world

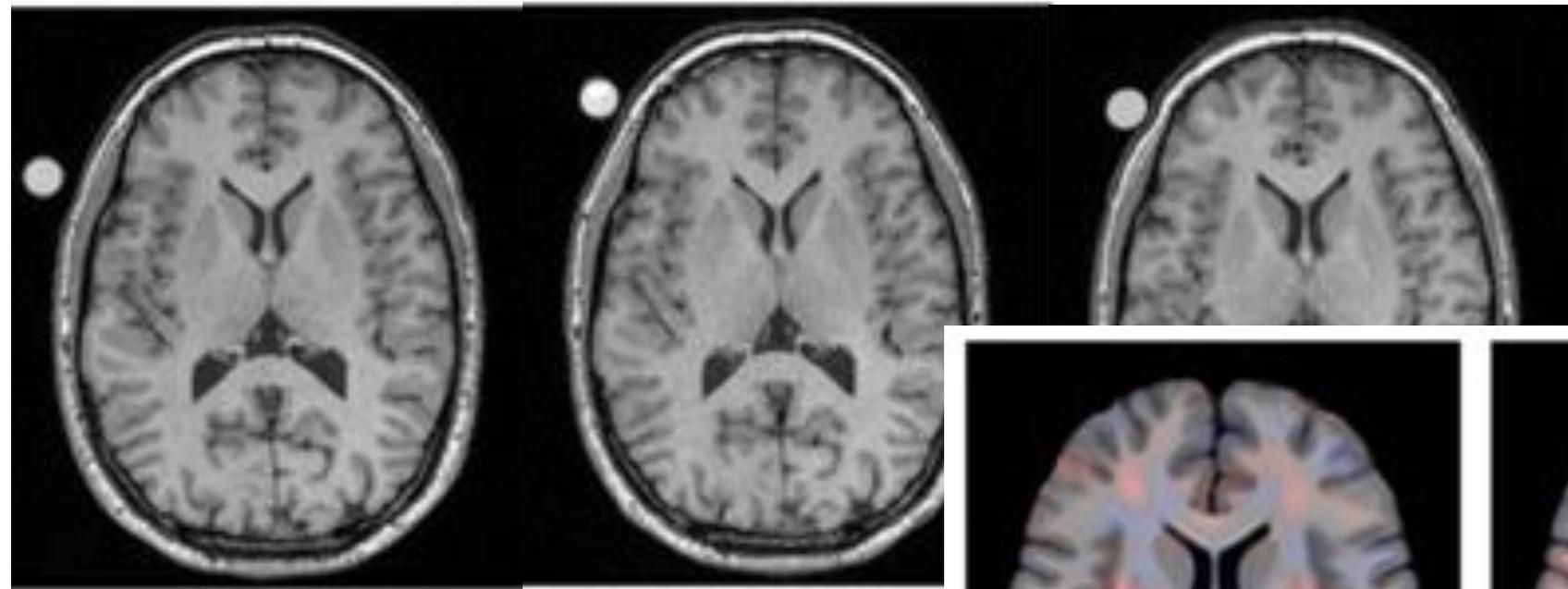
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Physiological variation.

Category	Topic
Physiological factors [11, 57, 64, 66, 70, 74, 75]	Age
	Body mass index
	Diurnal variation
	Genotype (ApoE expression)
	Hydration state
	Menstrual cycle

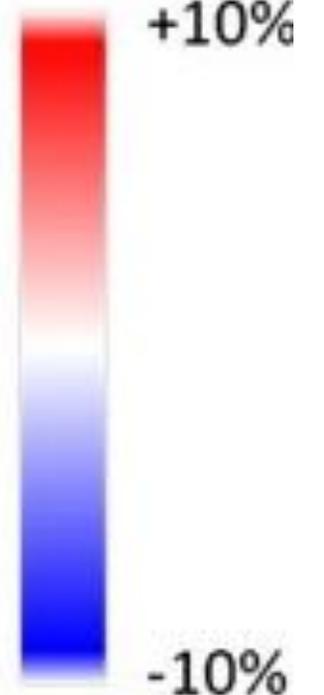
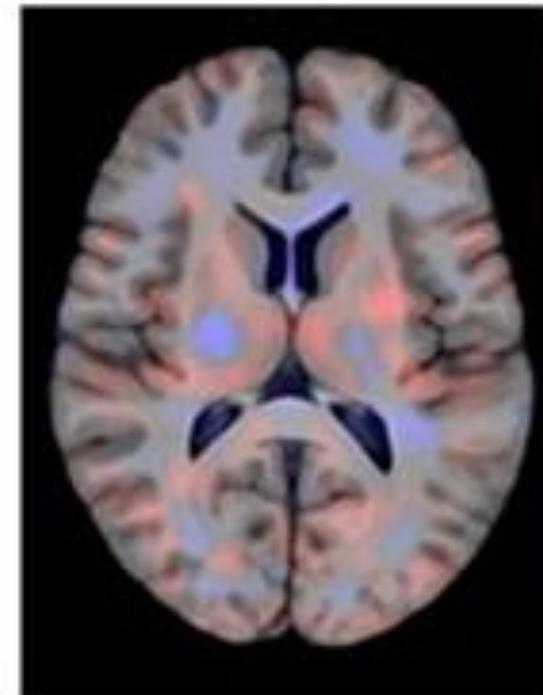
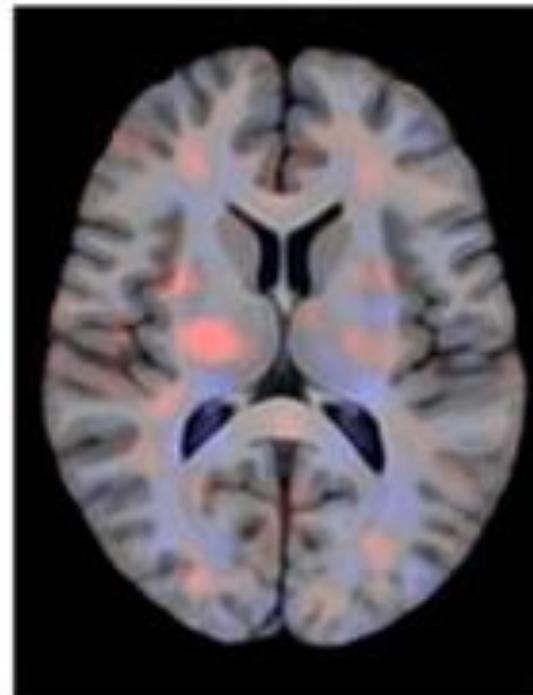
Physiological variation. Example 1 dehydration



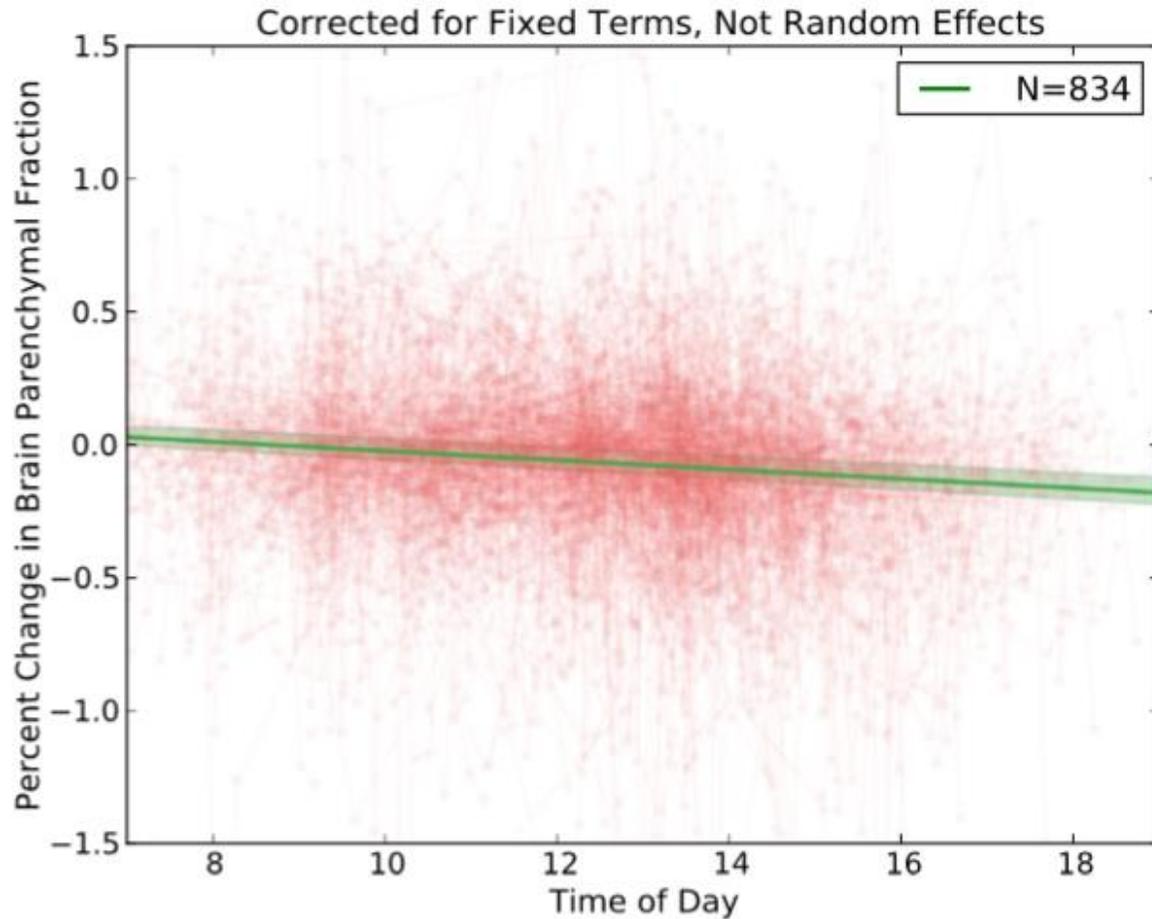
Dehydrated -> Rehydrated
PBVC +0.36%

Baseline T1W

Dehydrated T1



Physiological variation. Example 2 circadian rhythms



On 834 AD, the brain parenchyma fraction (BPF) decreased of -0.221% per 12 hours.

Review of the most important barriers to the use of atrophy measurement in the real world: list and possible solutions

❖ Physiological variation **SOLUTION:** to be included in the experimental design

Barriers to the use of brain volume in real world

$$\text{Change of Volume} = \text{True atrophy} + \Sigma$$

$$\begin{aligned} \text{Change of Volume} = & \text{True atrophy} + \text{Physiological variation} + \text{Software error} \\ & + \\ & \text{Variations due to the Acquisition} \\ & + \\ & \text{Errors due to the Image Acquisition} \end{aligned}$$

Error of Software

Which software?

JOURNAL OF MAGNETIC RESONANCE IMAGING 37:1-14 (2013)

Review _____

Clinical Use of Brain Volumetry

CME

Antonio Giorgio, MD, PhD and Nicola De Stefano, MD, PhD*

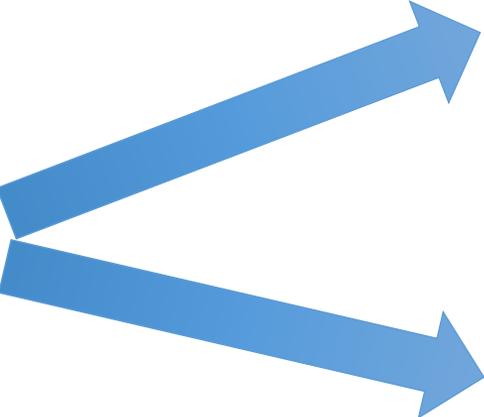


MRI-based methods for measuring brain volumes

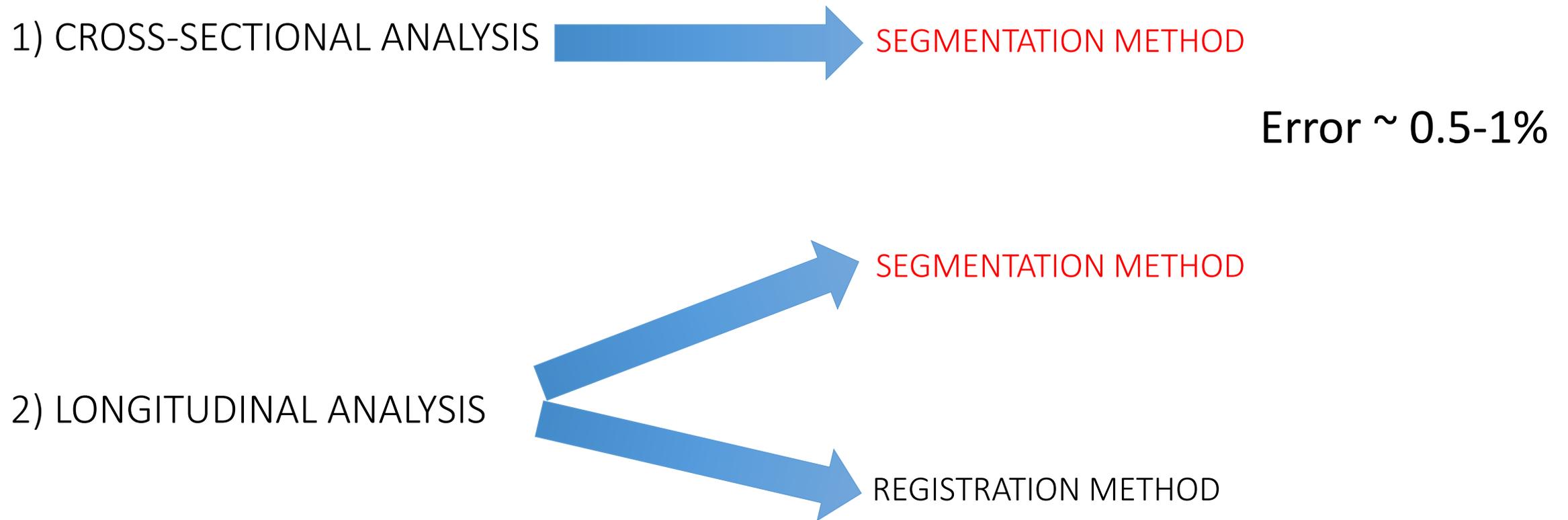
Features	
Manual methods	
Bicaudate ratio	The minimum intercaudate distance divided by brain width along same line
Brain width	Distance between two points on the cortical surface, measured at the same level as lateral ventricle width on axial slides
Corpus callosum area	Measured on midsagittal T1-weighted image
Training of the hippocampus, amygdala, entorhinal cortex, para-hippocampus, cholinergic nuclei of the basal forebrain	Several anatomical protocols available for delineation of these structures
M/P	Ratio of midbrain-to-pons areas measured on midsagittal T1-weighted image
MCP width	Distance between the superior and inferior borders of the MCP, as delimited by the peripeduncular CSF spaces of the pontocerebellar cisterns
MRPI	Value obtained by multiplying the pons to midbrain areas by the MCP-to-SCP widths
Third and lateral ventricle width	Determined along a plane corresponding to the anteroposterior midpoint of the ventricle on axial slices
Semi automated methods	
Anatomic	Segmentation algorithm for ventricles
Cavalieri method	Stereological method where brain volumes are obtained by the sum of the points counted on all the sections of the structure of interest multiplied by the sectioning intervals
Fuzzy connectedness	An operator identifies points of GM, WM and CSF, each of which is then automatically detected as a fuzzy connected object
ILAB4	Segmentation of thin-slice T1-weighted images based on a modified watershed transform and an automatic histogram analysis
Losseff method	A large central volume of the brain is defined based on anatomical criteria
MIDAS	Thresholding technique for measurement of ventricle volumes
SABRE	Use of individualized Talairach brain maps for brain regions in each hemisphere
Seed growing technique	Intensity threshold-based algorithm propagating from a seed positioned in any part of the brain parenchyma
Automated methods	
Alfano method	Multispectral methods based on the relaxometric features of brain tissues
BBSI	Measurement of total volume difference between serial scans
BICCR	Digital morphometry for intracranial cavity classification and Bayesian tissue classification into GM, WM, lesions and CSF
BPF	Ratio of the volume of parenchymal brain tissue to the total volume within the outer surface of the brain
BICVR	Ratio of brain volume to intracranial volume
Central cerebral volume	Volume of four to seven (depending on the thickness) axial slices from the central portion of the brain
Chupin method	Use of simultaneous region deformation driven by probabilistic and anatomical priors for hippocampus and amygdala segmentation
CIVET algorithm	Series of algorithms for corticometric analysis of MRI images including tissue classification and segmentation
Cortical pattern matching	Surface-based cortical modelling and 3D GM mapping
DBM	Variant of VBM in which brain volumes are compared on the basis of the deformation fields required to register them onto a common template
FIRST	Subcortical brain segmentation using Bayesian shape and appearance models
Freesurfer	Calculation of the cortical thickness after inflation of the folded cortical surface
HAMMER	High-dimensional warping of brain images producing gyral and subcortical brain structures and tissue density maps
Histogram segmentation	Brain extraction and segmentation technique optimised for 2D T1-weighted images
IBA	Percent ratio of the supratentorial brain parenchyma to supratentorial parenchyma and CSF
Localinfo	Entropy-based segmentation algorithm for subcortical brain structures
Segmentation propagation	Deformation field applied to the segmentation of the baseline brain and then automatically propagated through serial images to provide an estimate of volume change
SIENAx	Global and tissue-type volumes normalised for subject head size
SIENA, SIENAr	Percent brain volume change (PBVC) assessed by estimating the local shift in brain edges across the brain and its voxelwise extension for regional assessment
SPM-based segmentation	Prior spatial information are used to classify voxels according to their location and signal intensity features as GM, Wm and CSF
STAND score	Score based in the voxelwise degree and pattern of atrophy of a scan in comparison to the scans of a large database of well characterised AD and cognitively normal subjects
Support vector machines	Multidimensional classification of cerebral region (e.g. hippocampus) shape features
TDS	Brain tissues are identified by projecting anatomically labelled images of a template brain onto images of the patients brain
3DVIEWNIX	A data-, machine- and application-independent software system for the visualization and analysis of multidimensional images
VBM	Characterising regional volume and tissue 'concentration' differences throughout global brain
WBR	Ratio of the difference between intradural and CSF volumes to intradural volumes

Error of Software

1) CROSS-SECTIONAL ANALYSIS  SEGMENTATION METHOD

2) LONGITUDINAL ANALYSIS  SEGMENTATION METHOD
REGISTRATION METHOD

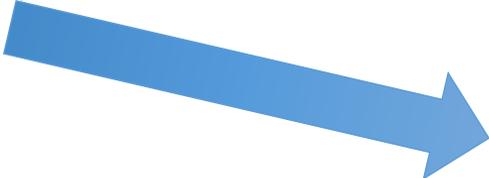
Error of Software



Error of Software

1) CROSS-SECTIONAL ANALYSIS  SEGMENTATION METHOD

2) LONGITUDINAL ANALYSIS  SEGMENTATION METHOD

2) LONGITUDINAL ANALYSIS  REGISTRATION METHOD Error $\sim 0.1-0.5\%$

Error of Software

Each software can be optimised depending on the studied population

Error of Software

Each software can be optimised depending on the the studied population

NeuroImage 61 (2012) 1484–1494



Contents lists available at SciVerse ScienceDirect

NeuroImage

journal homepage: www.elsevier.com/locate/ynimg



Optimizing parameter choice for FSL-Brain Extraction Tool (BET) on 3D T1 images in multiple sclerosis

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^a Department of Radiology, VU University Medical Center, Amsterdam, The Netherlands

^b Department of Neurological and Behavioral Sciences, University of Siena, Siena, Italy

^c Department of Physics and Medical Technology, VU University Medical Center, Amsterdam, The Netherlands

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^e FMRIB Centre, Nuffield Department of Clinical Neurosciences, University of Oxford, Oxford, UK

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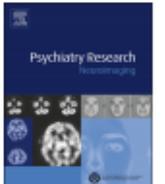
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journal homepage: www.elsevier.com/locate/psychresns



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The SIENA/FSL whole brain atrophy algorithm is no more reproducible at 3 T than 1.5 T for Alzheimer's disease

Keith S. Cover ^{a,*}, Ronald A. van Schijndel ^b, Veronica Popescu ^b, Bob W. van Dijk ^a, Alberto Redolfi ^c, Dirk L. Knol ^d, Giovanni B. Frisoni ^c, Frederik Barkhof ^{b,e}, Hugo Vrenken ^{a,b,e}, neuGRID¹, the Alzheimer's Disease Neuroimaging Initiative²

^a Department of Physics and Medical Technology, VU University medical center, Amsterdam, The Netherlands

^b Department of Radiology, VU University medical center, Amsterdam, The Netherlands

^c Laboratory of Epidemiology & Neuroimaging, IRCCS San Giovanni di Dio Fatebenefratelli, Via Pilastroni 4, 25125 Brescia, Italy

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^e MS Center Amsterdam and Alzheimer Center, VU University medical center, Amsterdam, The Netherlands

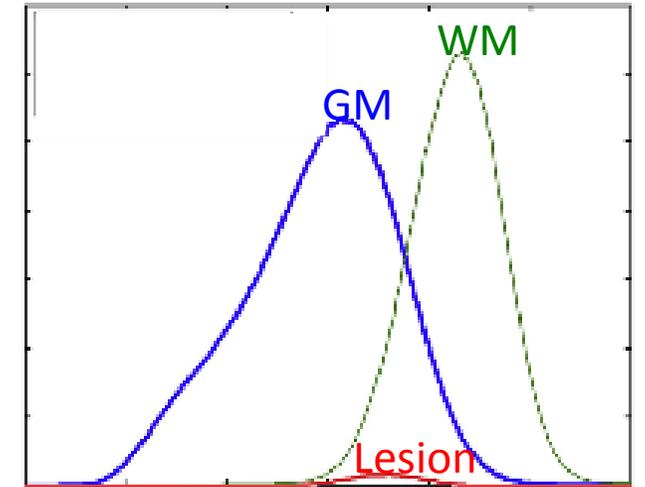
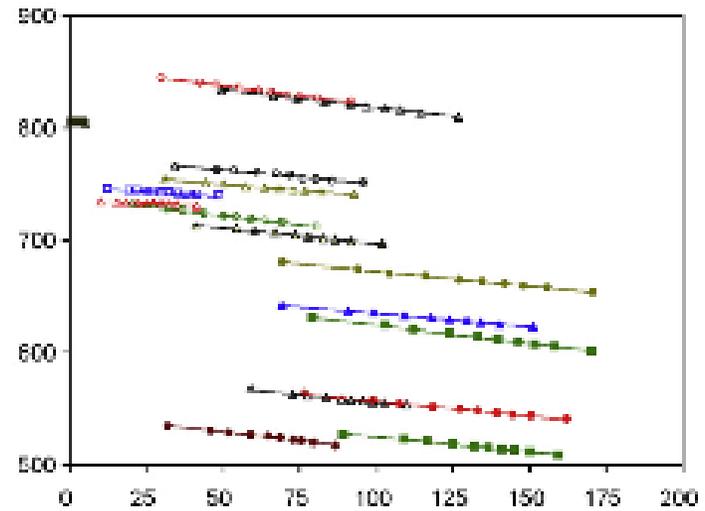
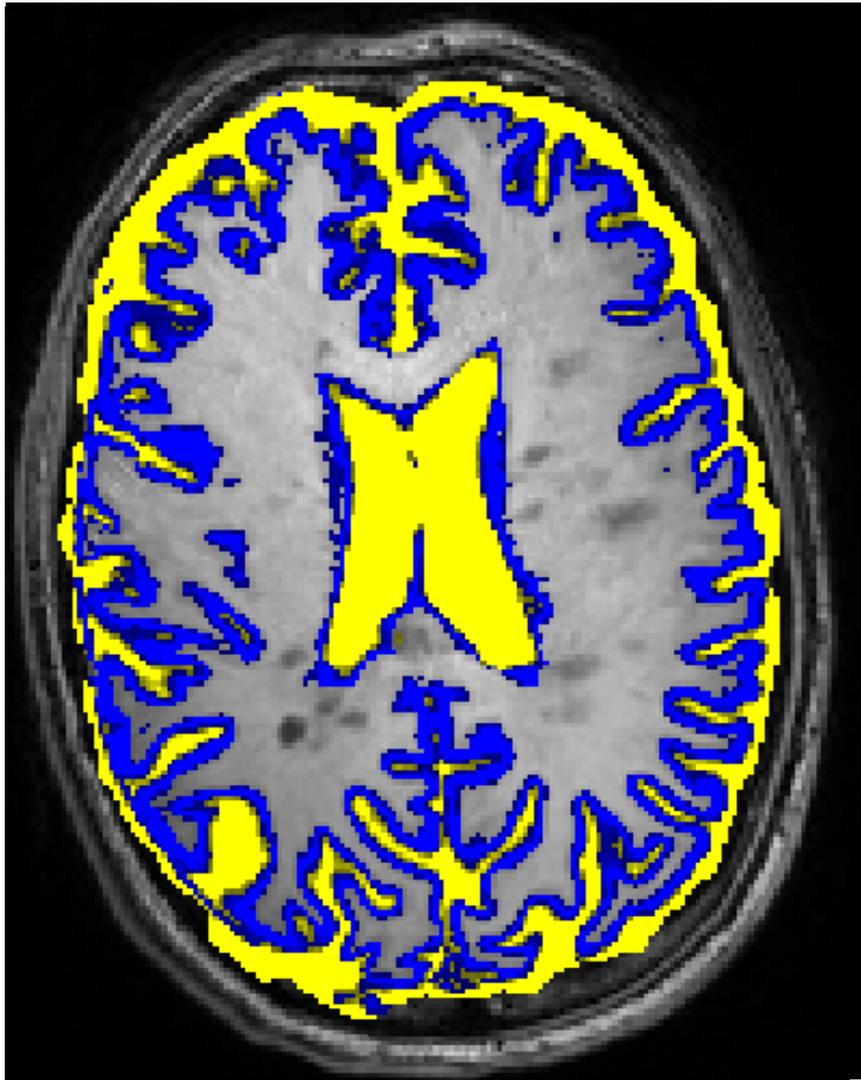


Error of Software

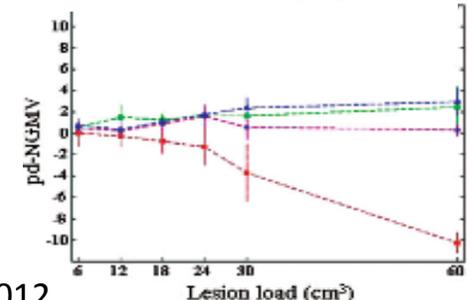
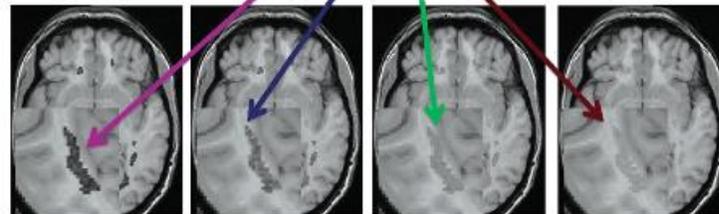
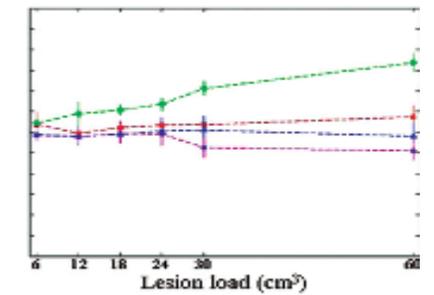
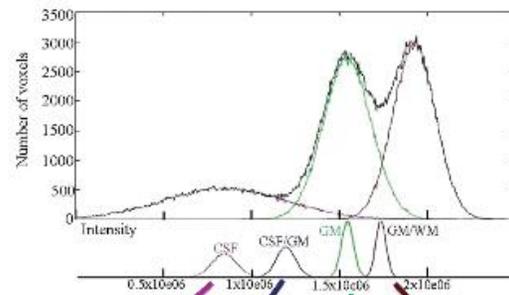
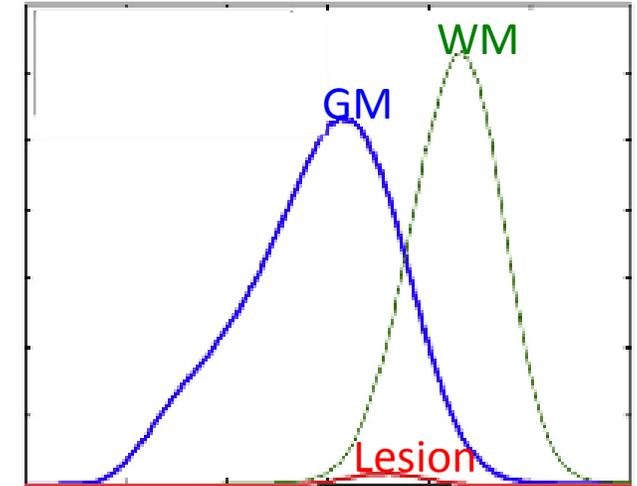
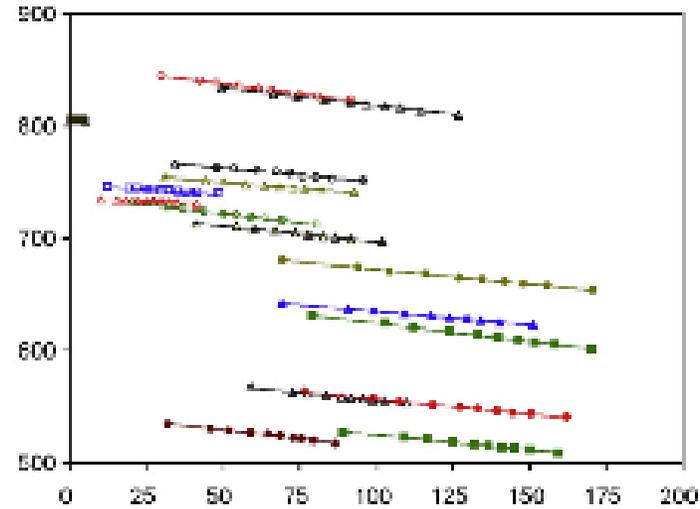
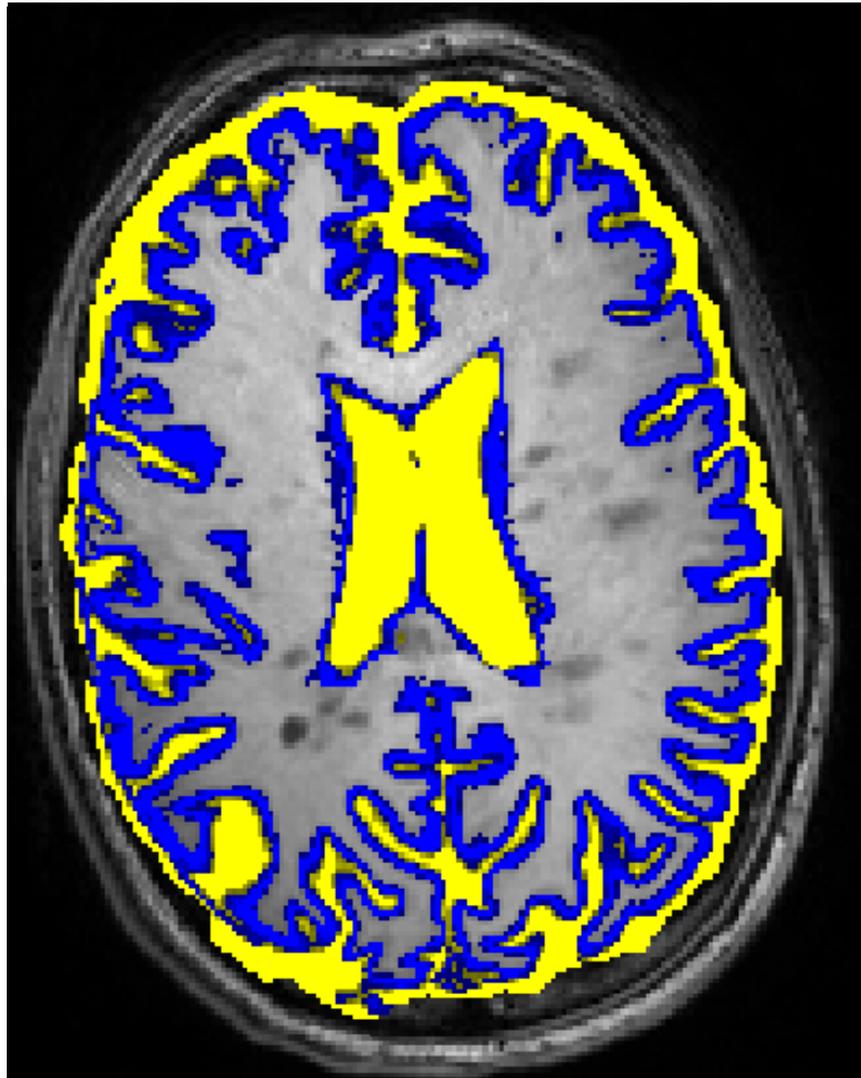
Each software can be optimised depending on the studied population

Each software can be improved in order to address the peculiar MRI features of patients

Error of Software: MRI of MS patients



Error of Software: MRI of MS patients



Error of Software: MRI of MS patients

Methods	Global WM intensity distribution	Local WM intensity distribution
Gaussian Kernel Based	Chard et al (J Mag Res Imaging, 2010)	Sdika et al (Human Brain Mapping 2009)
Non parametric		Battaglini et al (Human Brain Mapping 2012)

Review of the most important barriers to the use of atrophy measurement in the real world: list and possible solutions

- ❖ Physiological variation **SOLUTION:** to be included in the experimental design
- ❖ Error of the software **SOLUTION:**
 - ✓ optimise the software parameters for the specific analysis
 - ✓ Do not change version of the software during the experiment

Quantification of a measure for MR images

$$\text{Change of Volume} = \text{True atrophy} + \Sigma$$

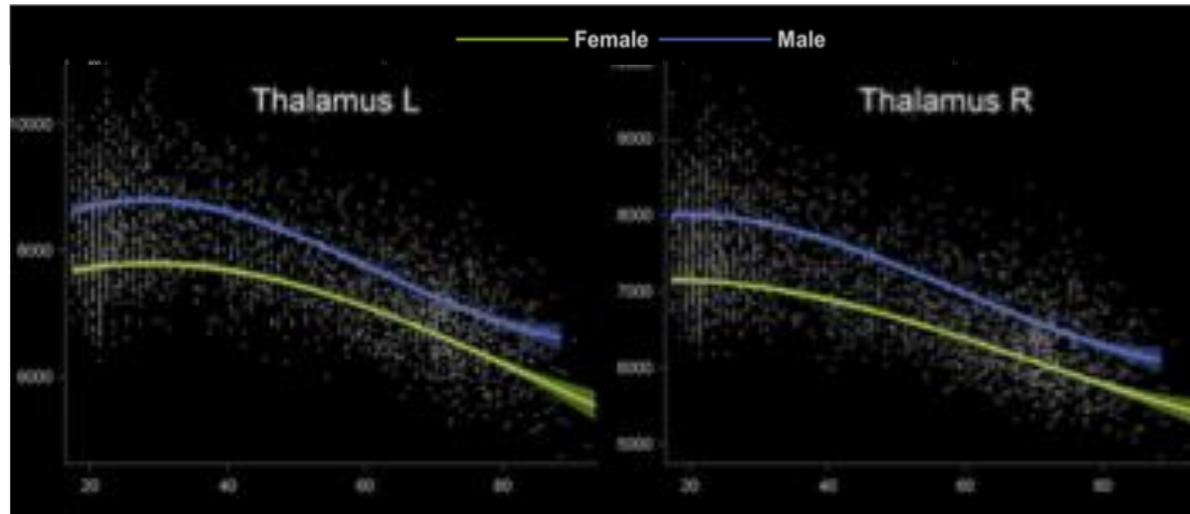
$$\begin{aligned} \text{Change of Volume} = & \text{True atrophy} + \text{Physiological variation} + \text{Software error} \\ & + \\ & \text{Variations due to the Image Acquisition} \\ & + \\ & \text{Errors due to the Image Acquisition} \end{aligned}$$

Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) Different acquisition parameters

Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) **Different vendor?**
 - 2) Different Magnetic Strength
 - 3) Different acquisition parameters



Thalamus L: Not significant
Thalamus R: -250 mm³
(Philips Vs Siemens)

Variations due to the acquisition

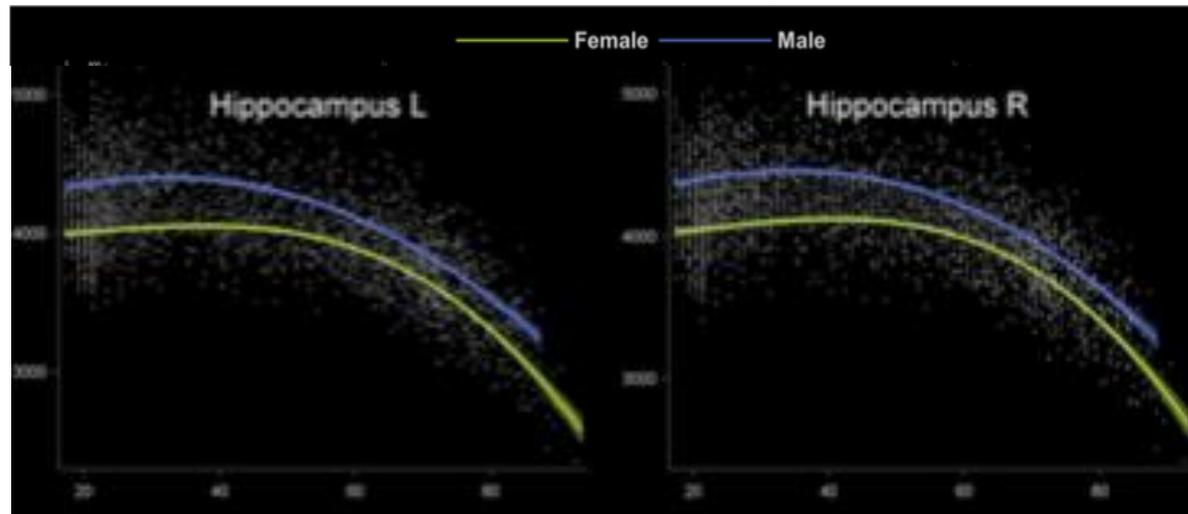
- Can the atrophy measurement be affected by:
 - 1) **Different vendor? YES** (due to different coil, changing SNR)
 - 2) Different Magnetic Strength
 - 3) Different acquisition parameters

Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) **Different Magnetic Strength?**
 - 3) Different acquisition parameters

Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) **Different Magnetic Strength?**
 - 3) Different acquisition parameters



Hippocampus L: -234 mm^3
Hippocampus R: -298 mm^3

Variations due to the acquisition

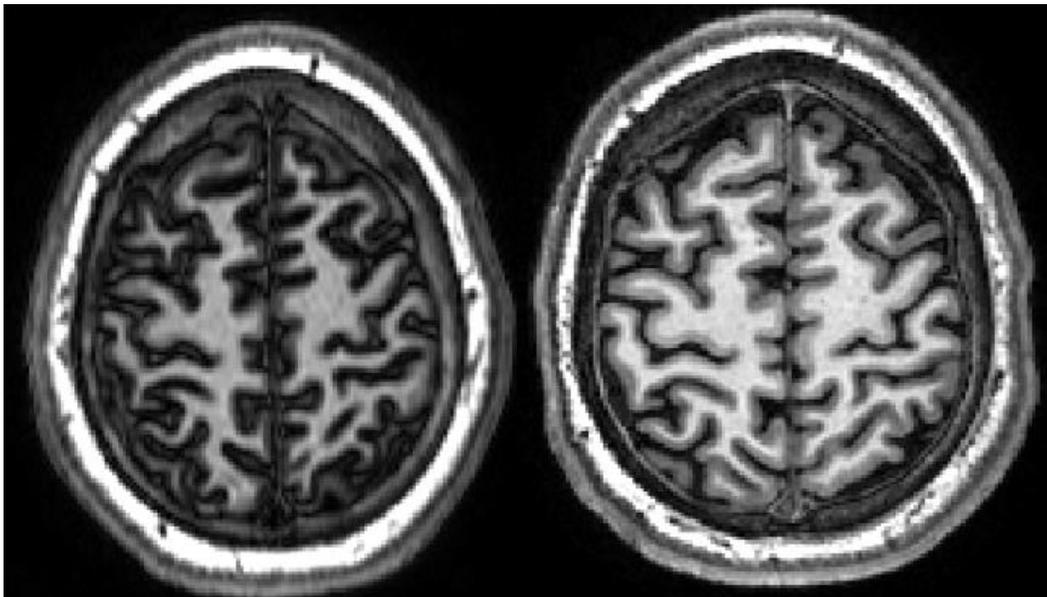
- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) **Different Magnetic Strength? YES** (due to improved tissue contrast in 3T)
 - 3) Different acquisition parameters

Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) **Different acquisition parameters?**

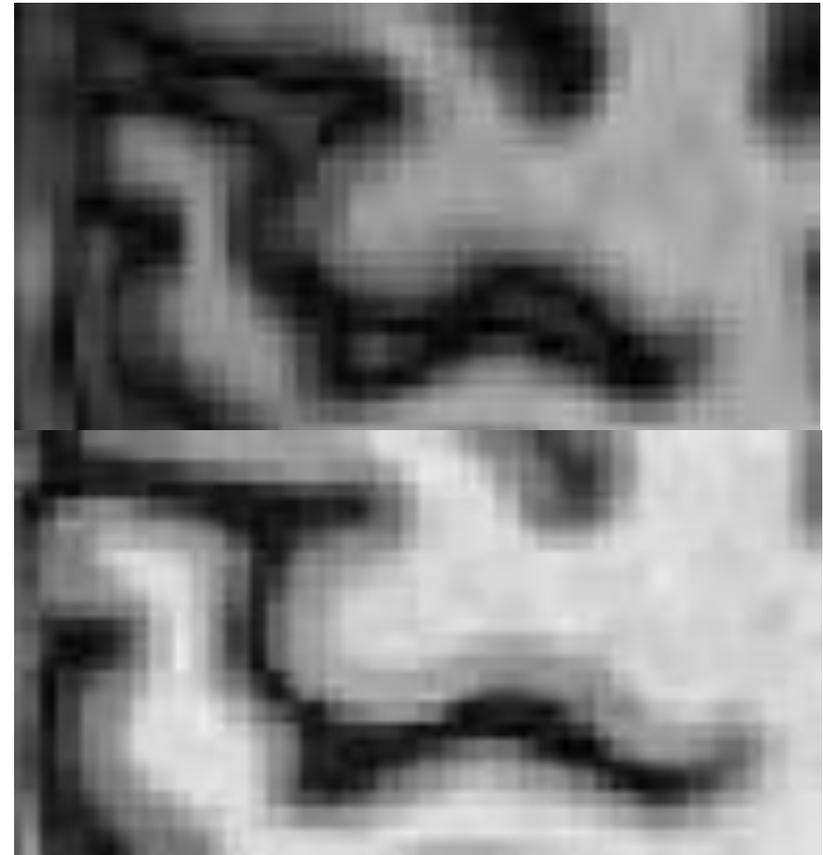
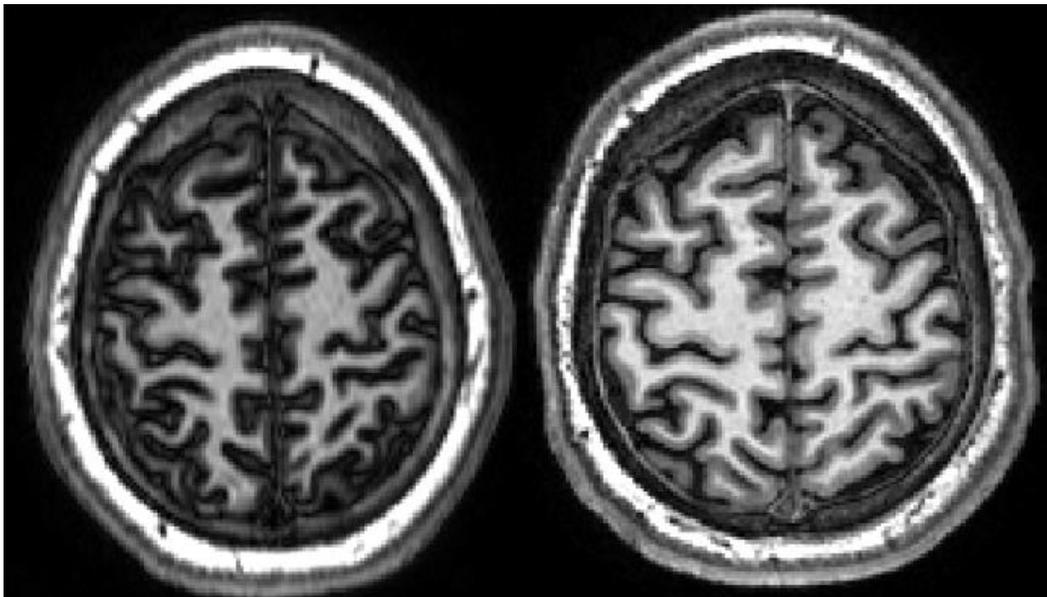
Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) **Different acquisition parameters?**



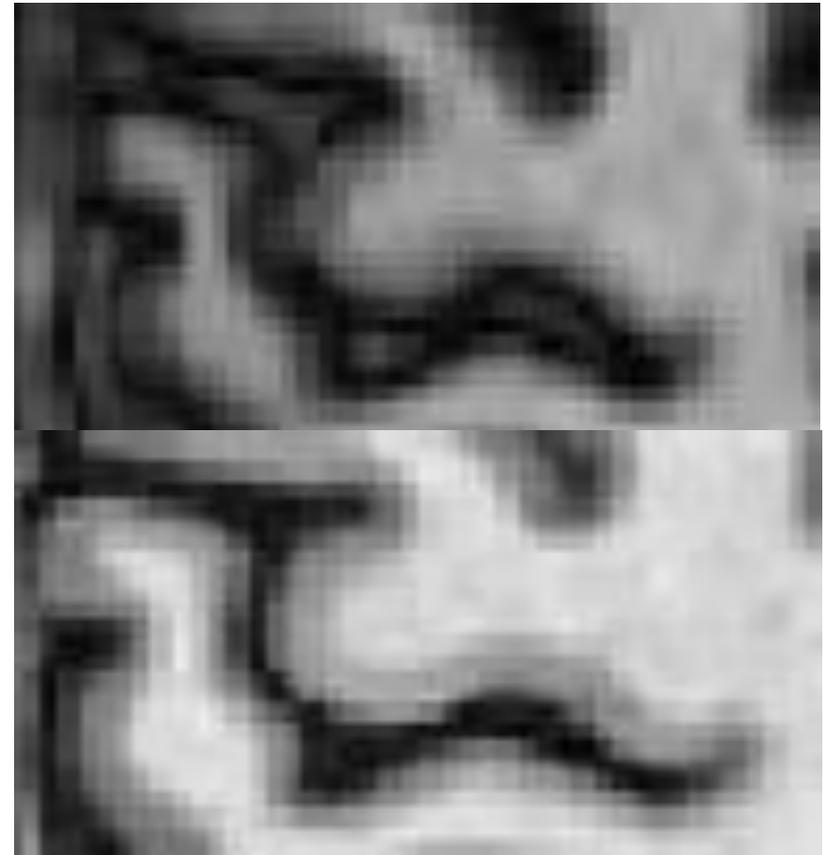
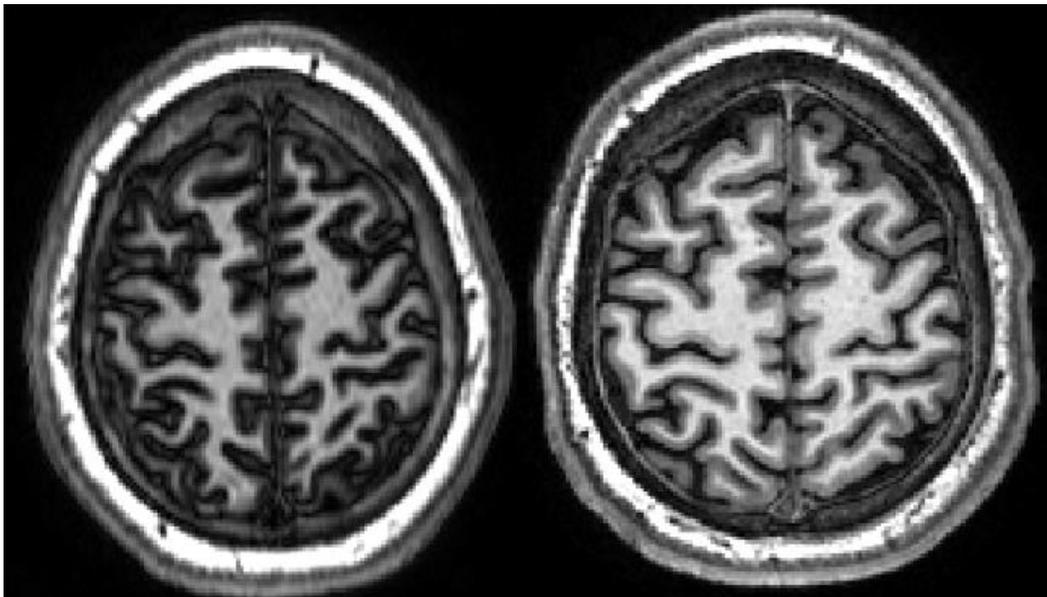
Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) **Different acquisition parameters?**



Variations due to the acquisition

- Can the atrophy measurement be affected by: **PBVC= -10%**
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) **Different acquisition parameters?**



Variations due to the acquisition

- Can the atrophy measurement be affected by:
 - 1) Different vendor
 - 2) Different Magnetic Strength
 - 3) **Different acquisition parameters? YES** (Different TR and TE, with the same vendor and magnetic strength, give different tissue contrast!)

Review of the most important barriers to the use of atrophy measurement in the real world: list and possible solutions

- ❖ Physiological variation **SOLUTION:** to be included in the experimental design
- ❖ Error of the software **SOLUTION:**
 - ✓ optimise the software parameters for the specific analysis
 - ✓ Do not change version of the software during the experiment
- ❖ Variation due to the image acquisition: **SOLUTION:**
 - ✓ do not change hardware and software MRI equipment over time;
 - ✓ set the best parameters to obtain high SNR and CNR.

Quantification of a measure for MR images

$$\text{Change of Volume} = \text{True atrophy} + \Sigma$$

$$\begin{aligned} \text{Change of Volume} = & \text{True atrophy} + \text{Physiological variation} + \text{Software error} \\ & + \\ & \text{Variations due to the Image Acquisition} \\ & + \\ & \text{Errors due to the Image Acquisition} \end{aligned}$$

Errors due to the image acquisition

artifacts

RF bias field

- Ghosting/Wrap
- Poor contrast/SNR

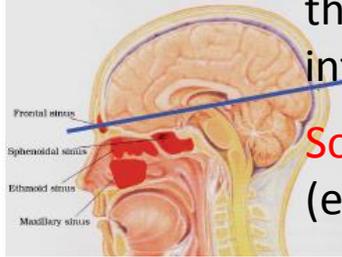


depends on coil architecture

the acquired image has strong intensity inhomogeneities

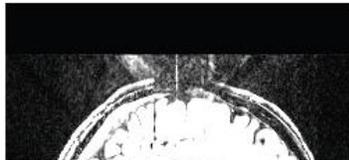
due to magnetic susceptibility differences
Solutions: post-processing software (e.g. N3, FAST, SPM)

- B_1 RF bias field
- Ghosting/Wrap
- Poor contrast/SNR
- B_0 inhomogeneity

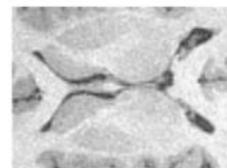
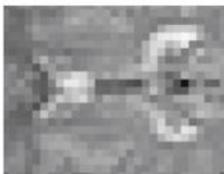
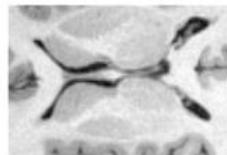


Solution: gradient correction during the acquisition, post-processing software (FAST) poor shimming, gradient coil patient motion, reconstruction

- RF bias field
- Ghosting/Wrap
- Poor contrast/SNR
- B_0 inhomogeneity



- RF bias field
- Ghosting/Wrap
- Poor contrast/SNR
- B_0 inhomogeneity

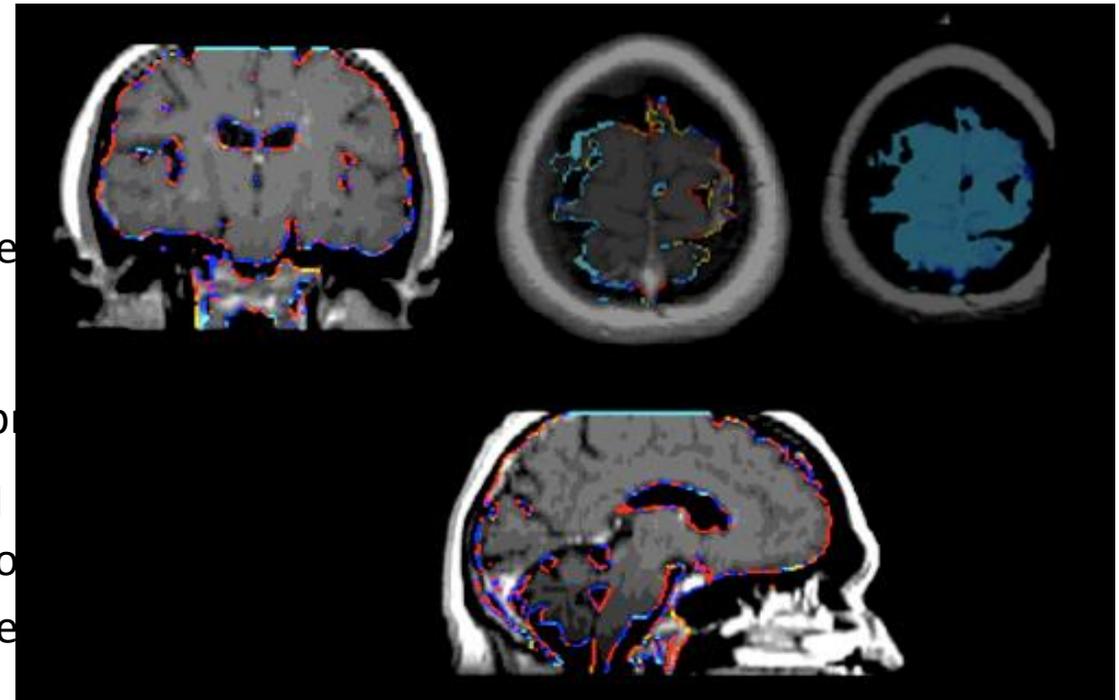


tion: to acquire again the

MR field strength, type of coil, parameter acquisitions (TR and TE)

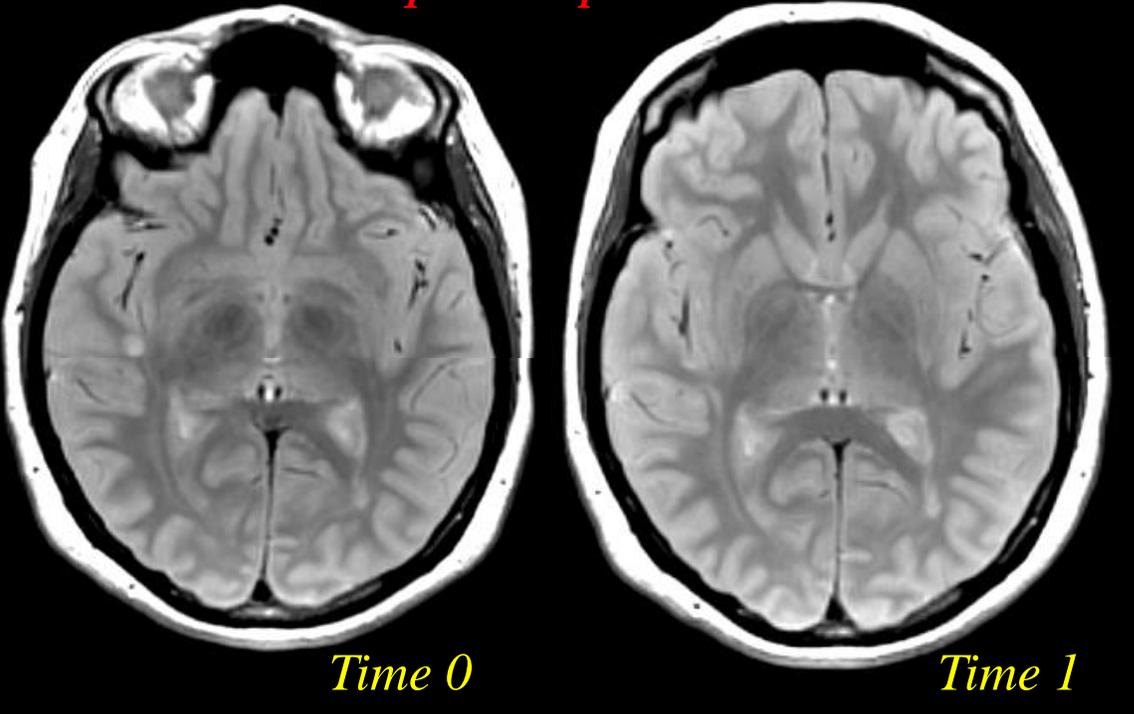
Solution: to use MR scanner with higher field, to set carefully parameters of your acquisition (TR, TE)

Partial head



Errors due to the acquisition

Acquisition problem



Bad repositioning can bias atrophy measurement

Review of the most important barriers to the use of atrophy measurement in the real world: list and possible solutions

- ❖ Physiological variation **SOLUTION:** to be included in the experimental design
- ❖ Error of the software **SOLUTION:**
 - ✓ optimise the software parameters for the specific analysis
 - ✓ Do not change version of the software during the experiment
- ❖ Variation due to the image acquisition: **SOLUTION:**
 - ✓ do not change hardware and software MRI equipment over time;
 - ✓ set the best parameters to obtain high SNR and CNR.
- ❖ Errors due to the acquisition **SOLUTION:**
 - ✓ Use the gradient correction option during the MR acquisitions
 - ✓ Perform quality control (check for movement artifact, bad repositioning)
 - ✓ Perform appropriate post-processing for improving MRI quality

Definition of measurement for a MR image.

Review of the most important barriers to the use of atrophy measurement in the real world:
list and possible solutions

Normative rates of atrophy: a lack for the clinical use of brain volume measurement in the
real world

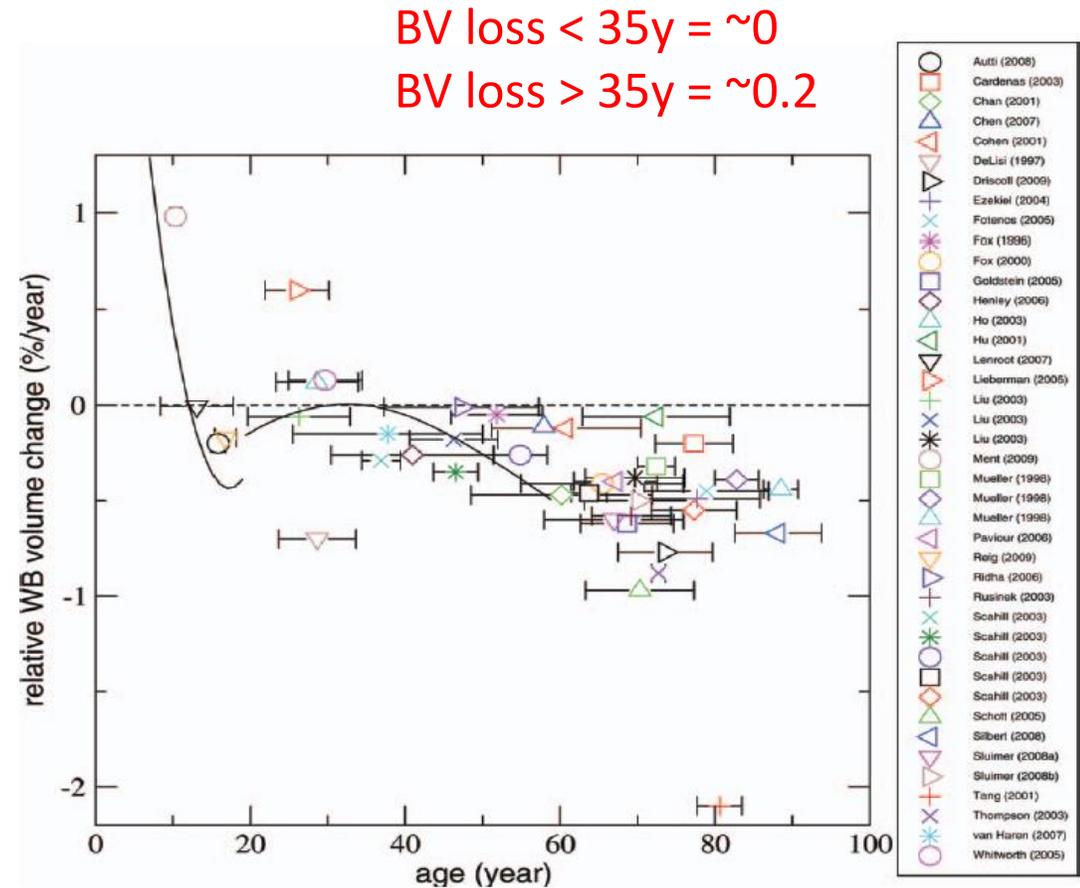
Normative rates of atrophy

◆ Human Brain Mapping 33:1987–2002 (2012) ◆

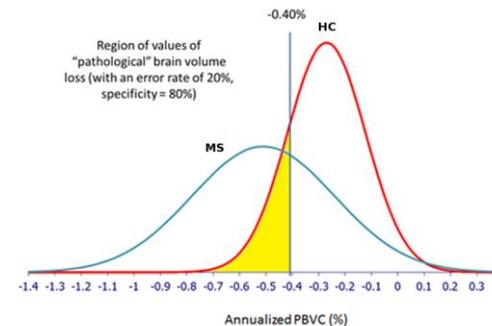
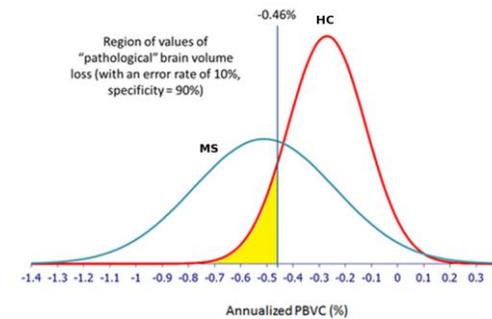
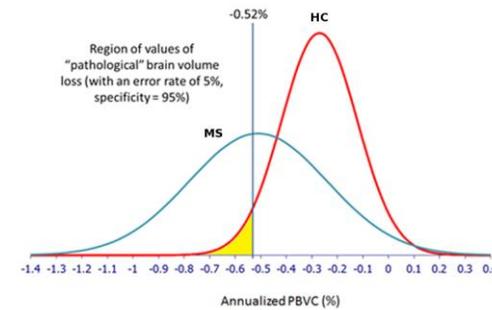
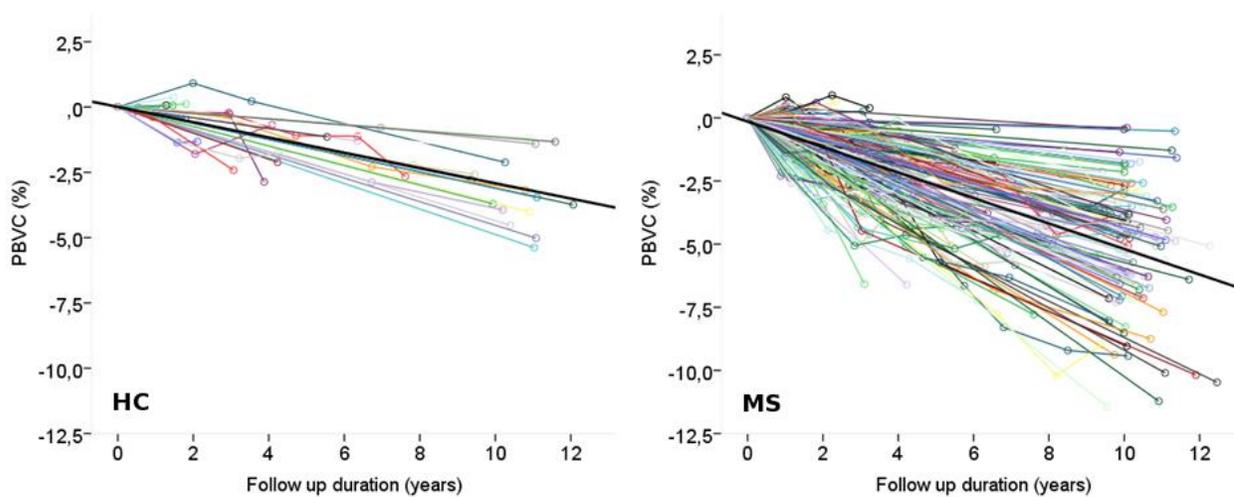
Human Brain Changes Across the Life Span: A Review of 56 Longitudinal Magnetic Resonance Imaging Studies

Anna M. Hedman*, Neeltje E.M. van Haren, Hugo G. Schnack,
René S. Kahn, and Hilleke E. Hulshoff Pol

*Rudolf Magnus Institute of Neuroscience, Department of Psychiatry,
University Medical Centre Utrecht, The Netherlands*



Normative rates of atrophy



MS patients: 206
Healthy Control: 35

Long follow-up > 6 years

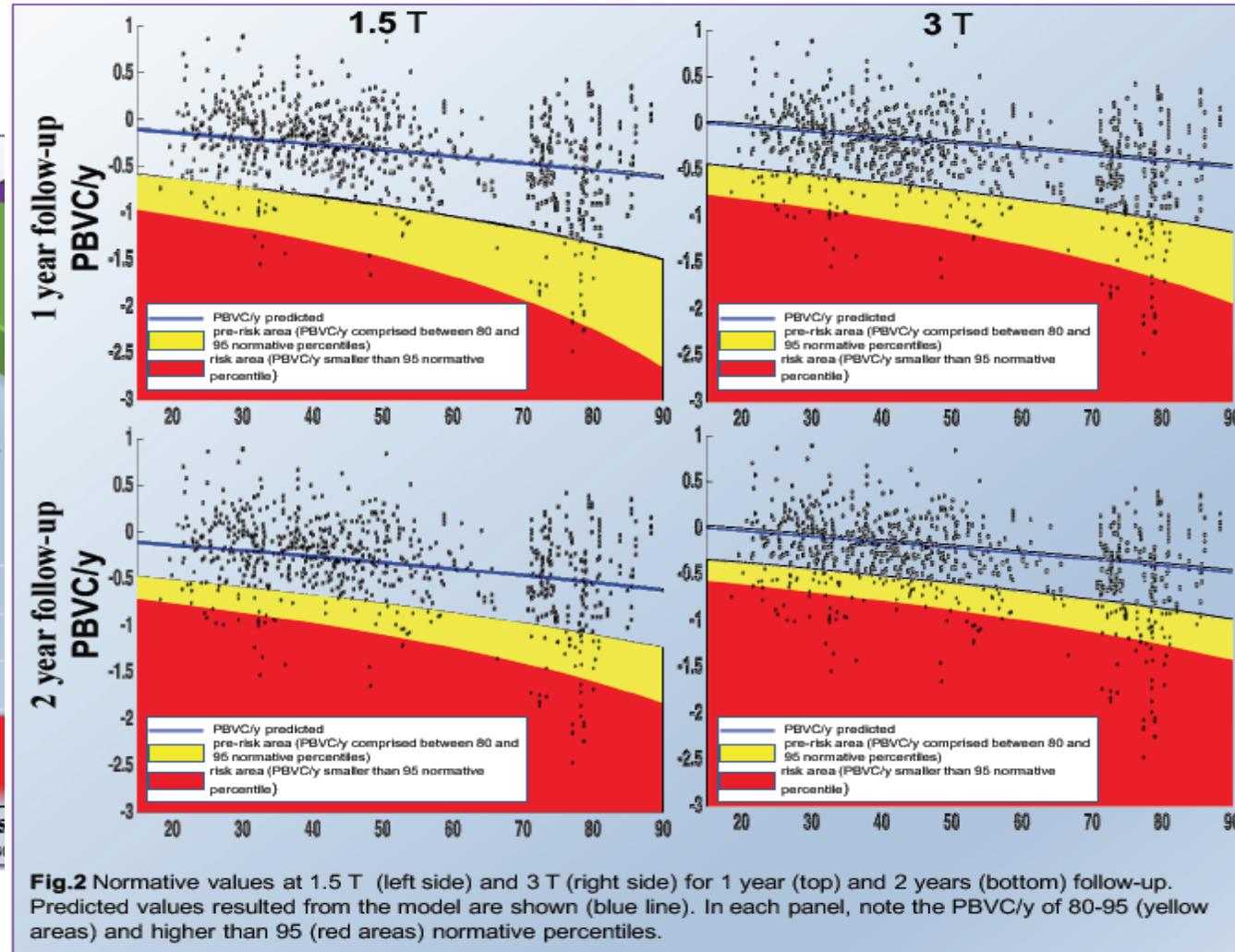
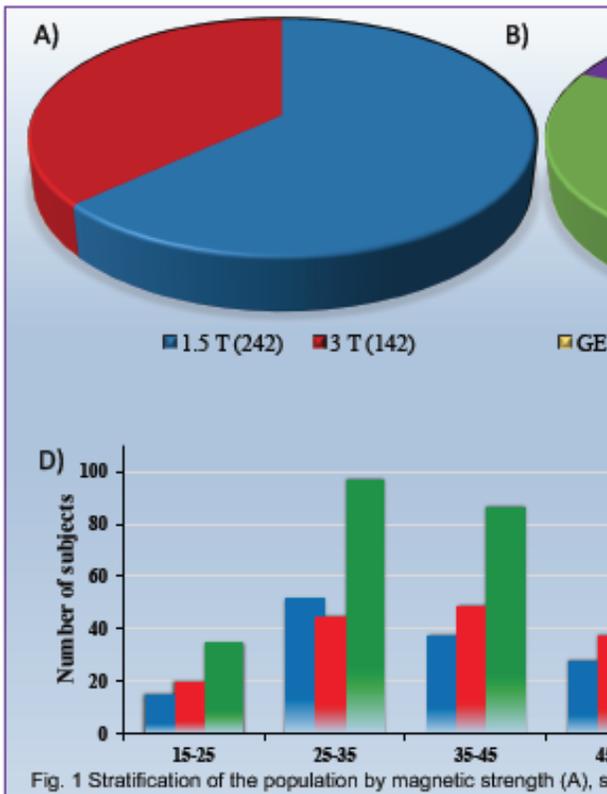
Same scanner: Philips 1.5T

PBVC cutoffs	Specificity	Sensitivity
-0.52%	95% (observed 97%)	49% (observed 44%)
-0.46%	90% (observed 91%)	56% (observed 48%)
-0.40%	80% (observed 86%)	65% (observed 61%)

Specificity= probability of being below the cutoff for an HC

Sensitivity= probability of being above the cutoff for a MS patient

Normative rates of atrophy



Healthy Controls: n=386

Variable follow-up:
median 1.1 y; (0.5y – 12y)

Different MR setting

Normative rates of atrophy: a lack for the clinical use of brain volume measurement in the real world

- ✧ Multicentre data from HC at different age and magnetic field strength show significant variability, explaining the difficulties in using atrophy rate for single patient assessment.
- ✧ Statistical models can provide normative data that take into account all these variables.
- ✧ For atrophy rates, the variability decreases with increases of follow-up length. Data at 3T seem to be less variable than data at 1.5T

.

Take home message:

The impact of the barriers to brain volume measurement in the real world can be drastically reduced by:

- ❖ carefully designing the experiment
- ❖ carefully setting the MR scan and sequences
- ❖ using dedicated, optimised software

Normative data are essential for better characterizing the individual course of the atrophy



MCCQ-1 Quantification of atrophy in longitudinal setting.

Which is the most precise and robust method for evaluating whole brain volume changes over time on MRI?

1. Segmentation method
2. Registration method
3. None of them, all the methods have the same magnitude of error.

MCCQ-1 Quantification of atrophy in longitudinal setting.

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MCCQ-2 Error of segmentation on MRI of MS patients

Does the lesion filling permit a better evaluation of

1. CSF?
2. Whole brain?
3. GM and WM separately?
4. optic nerve?

MCCQ-2 Error of segmentation on MRI of MS patients

Does the lesion filling permit a better evaluation of

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MCCQ-3 Reduction of source of variability

A more robust quantification of atrophy can be obtained by:

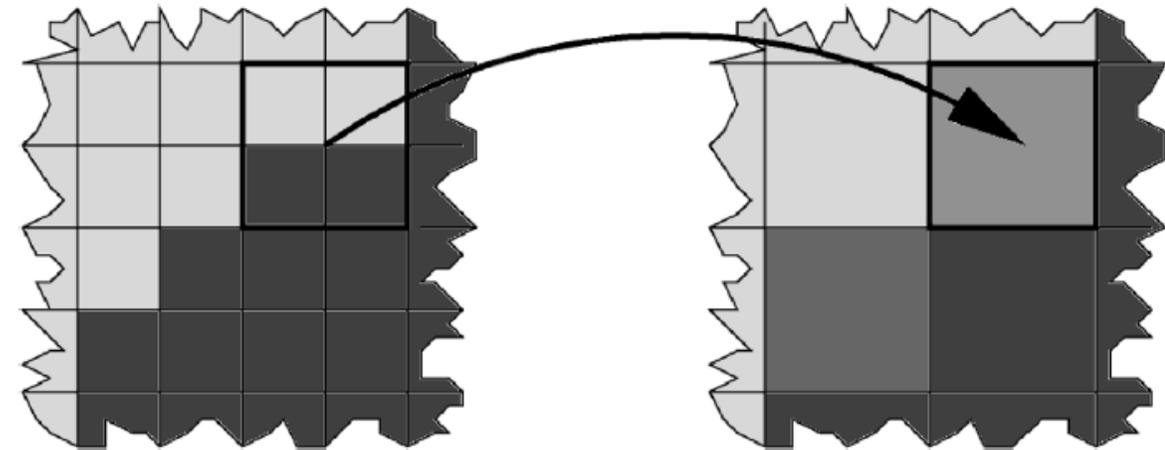
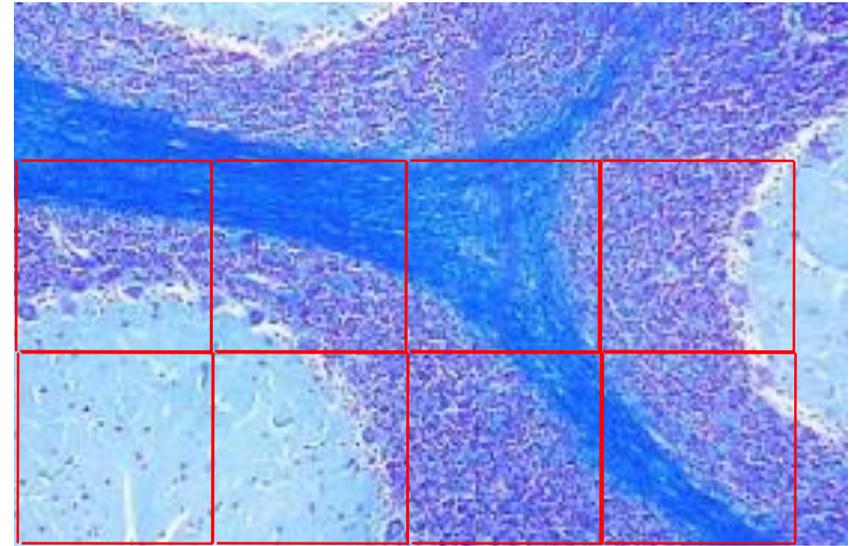
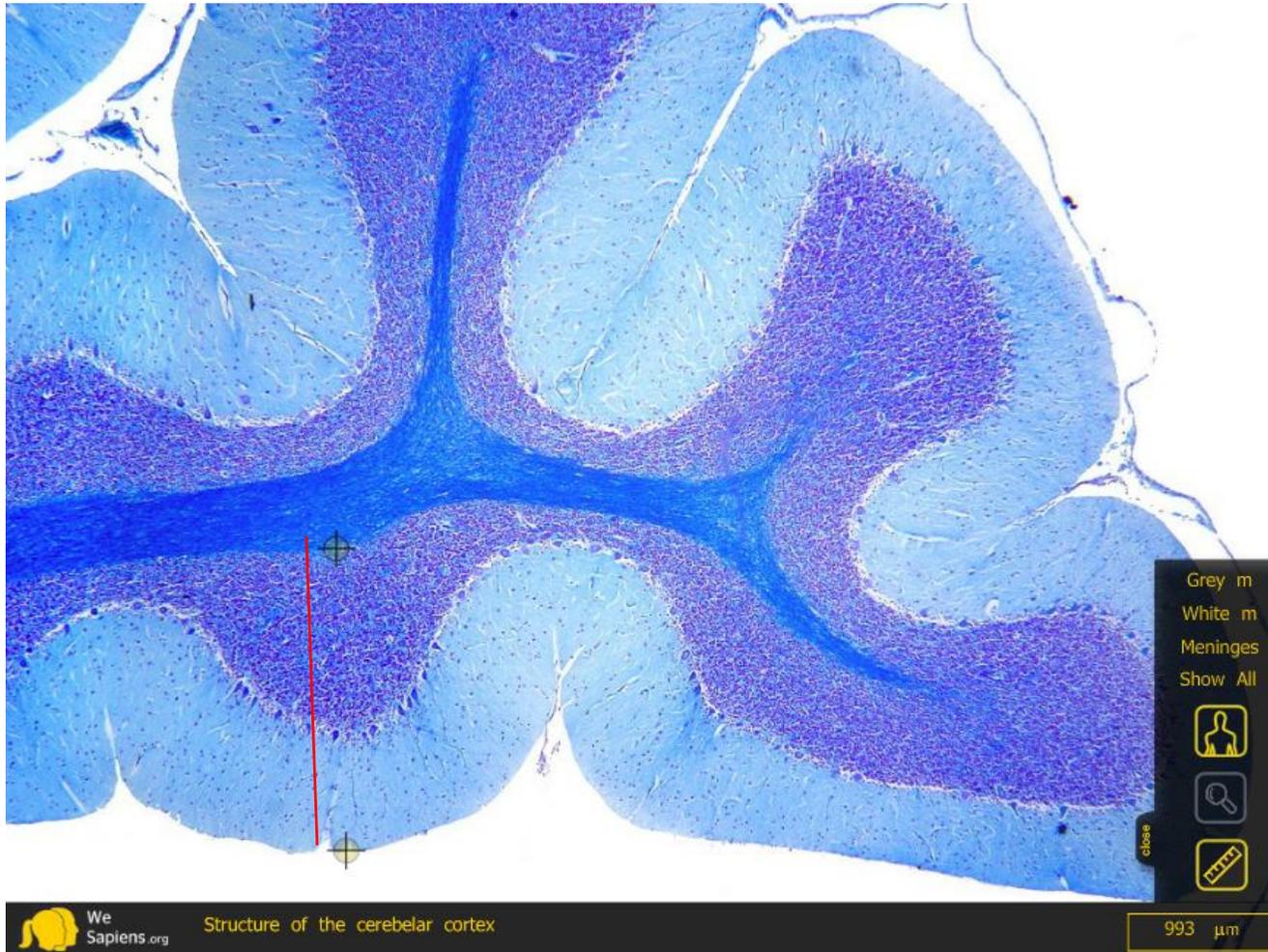
1. an accurate repositioning of the subject in the scan
2. an accurate post-processing to remove Magnetic field inhomogeneity
3. strictly keeping the same sequences during different MRI sessions
4. All of them

MCCQ-3 Reduction of source of variability

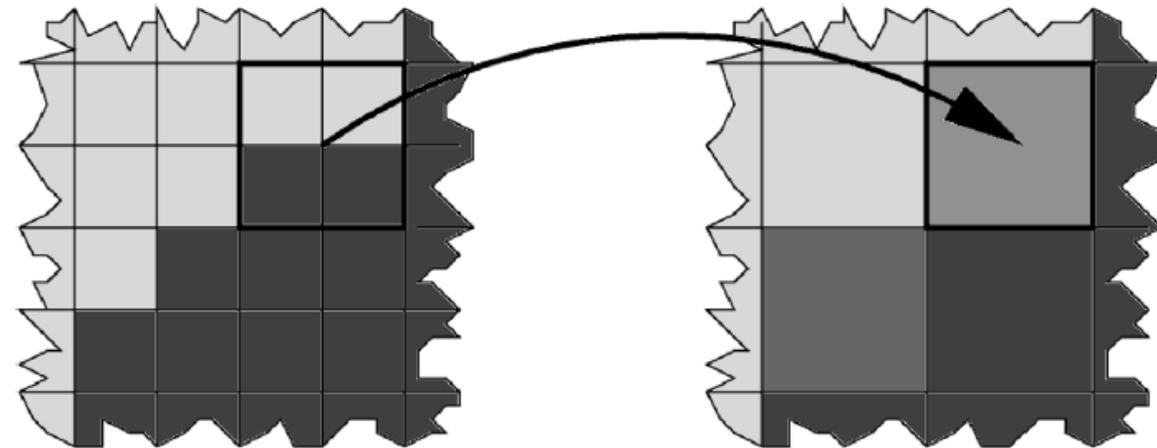
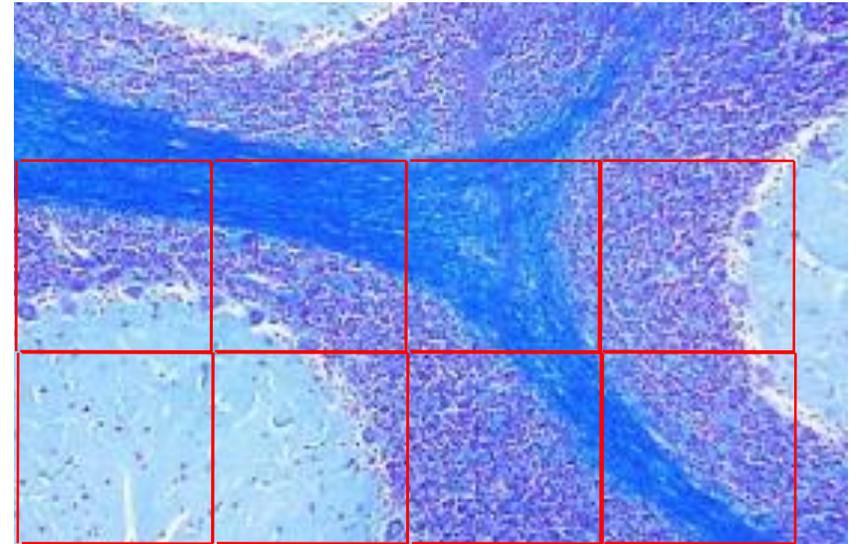
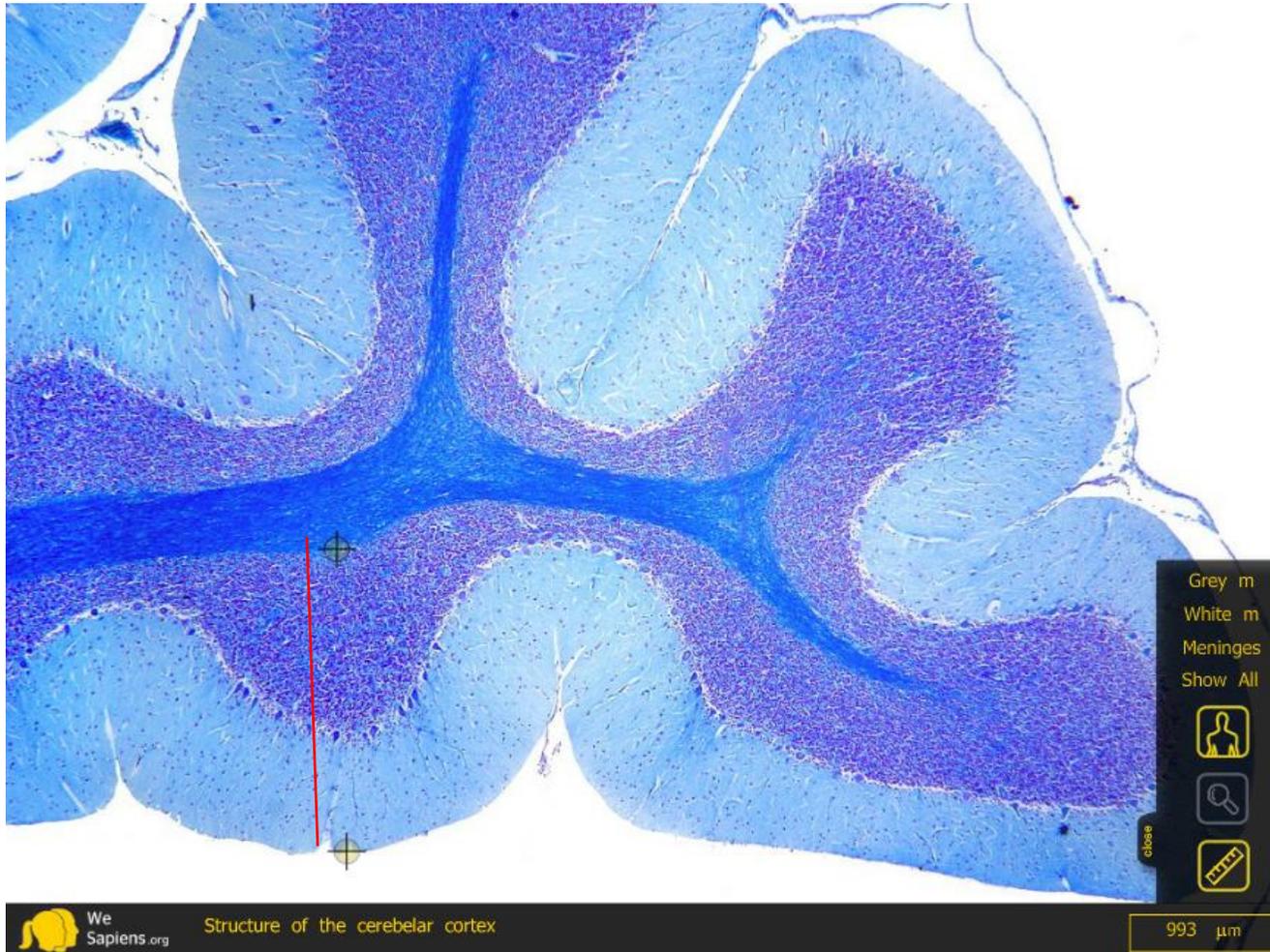
A more robust quantification of atrophy can be obtained by:

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4. All of them

Error of Software Segmentation methods



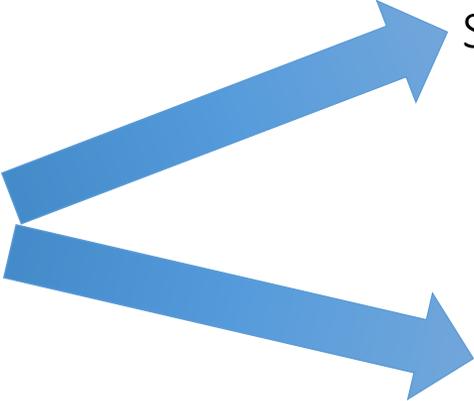
Error of Software Segmentation methods



ERROR ~0.5-1%

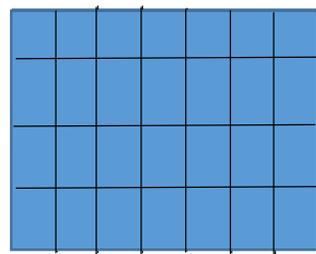
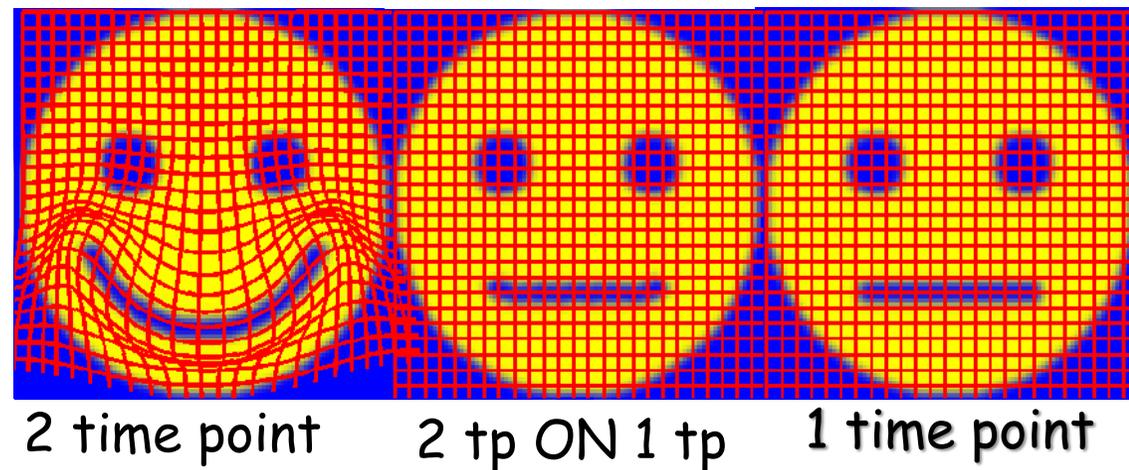
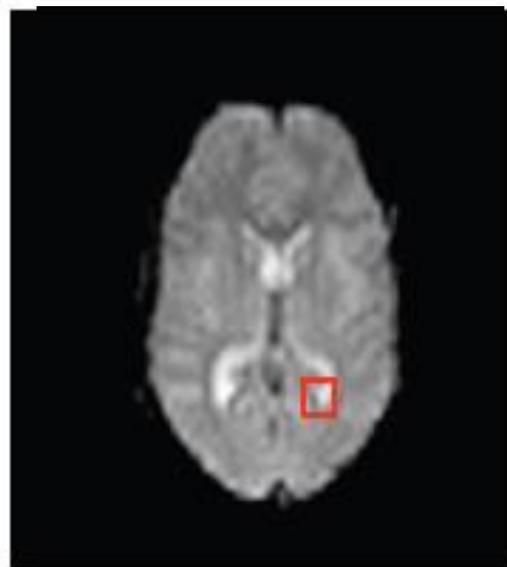
Error of Software

1) CROSS-SECTIONAL ANALYSIS  SEGMENTATION METHOD

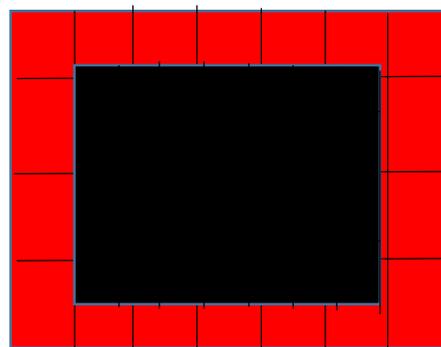
2) LONGITUDINAL ANALYSIS  SEGMENTATION METHOD
REGISTRATION METHOD

Error of Software

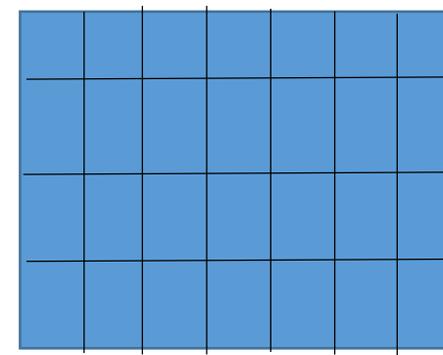
Registration methods



ROI at 2 tp



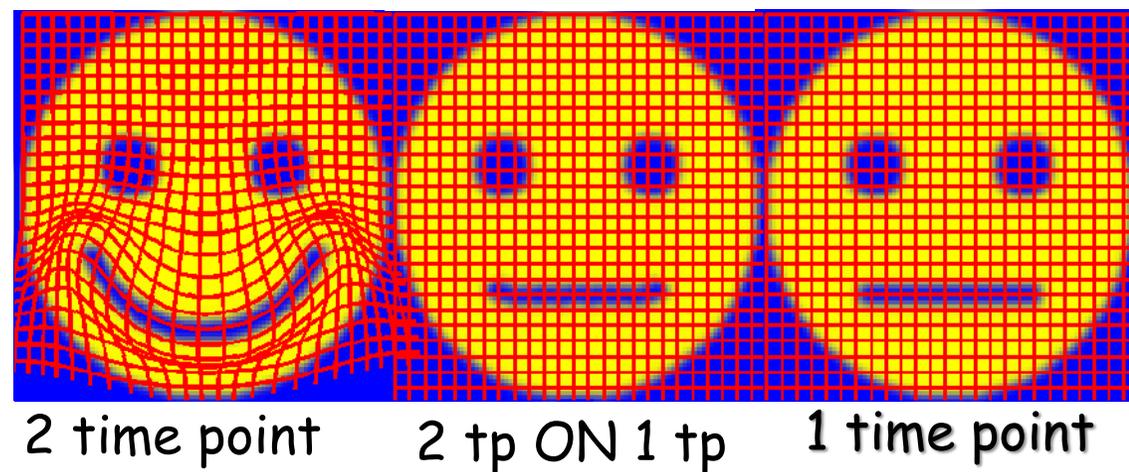
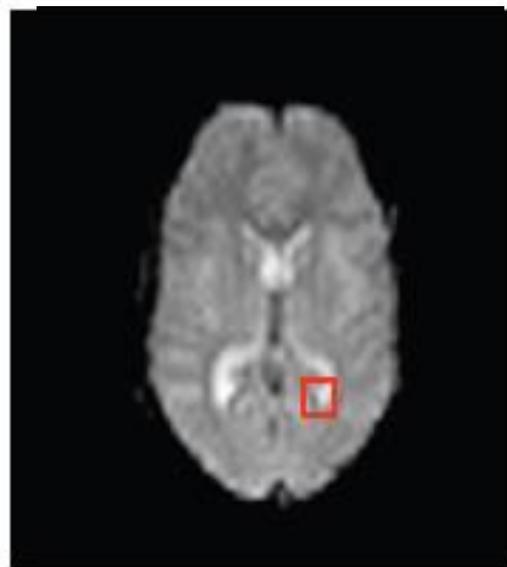
RED: ATROPHY



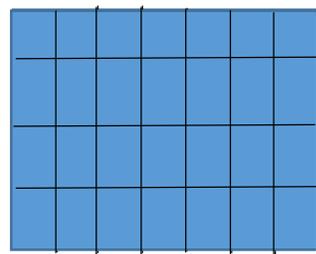
ROI at 1 tp

Error of Software

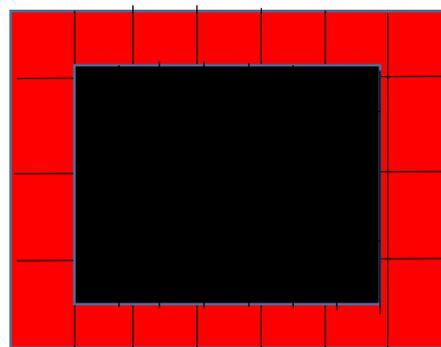
Registration methods



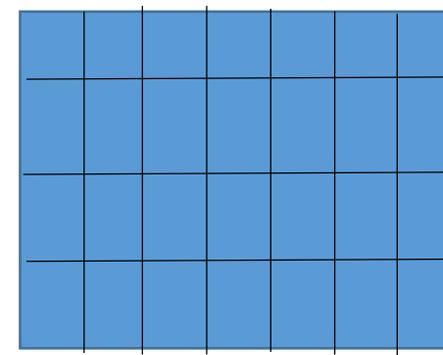
ERROR $\sim 0.1-0.5\%$



ROI at 2 tp



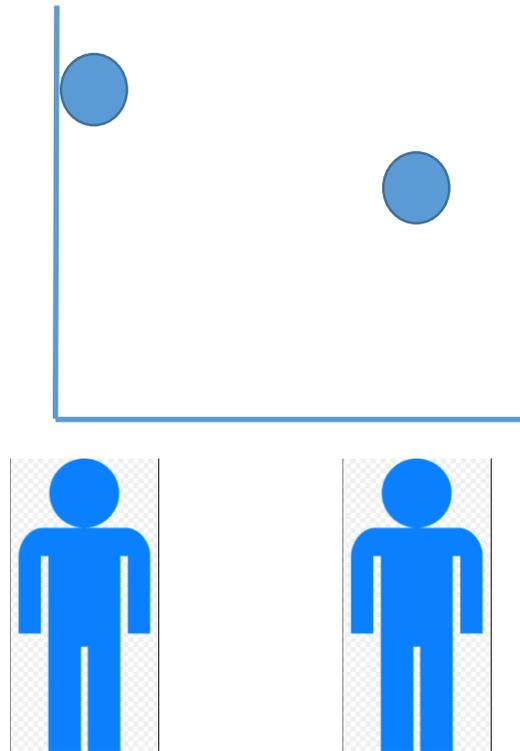
RED: ATROPHY



ROI at 1 tp

Quantification of a measure for MR images

$$\text{Change of Volume} = \text{True atrophy} + \Sigma$$

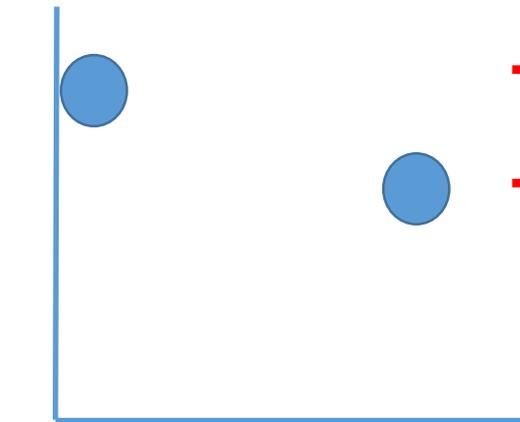


Quantification of a measure for MR images

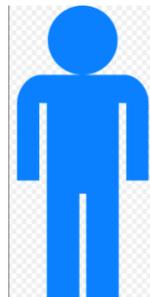
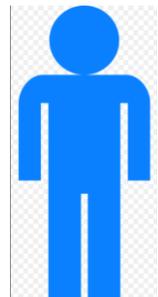
Change of Volume = True atrophy + Σ

Vol time 1

Vol time 2

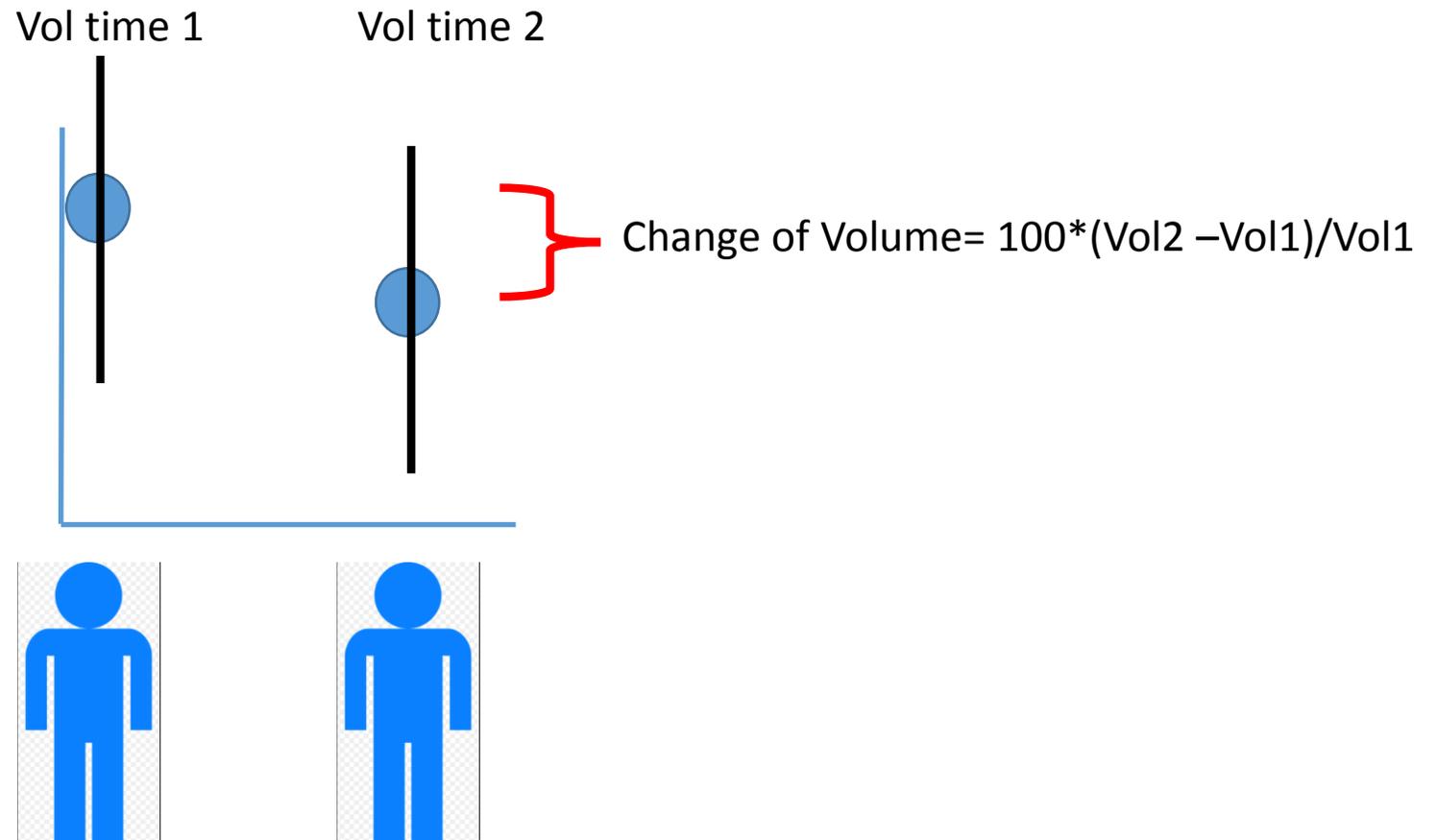


Change of Volume = $100 * (Vol2 - Vol1) / Vol1$



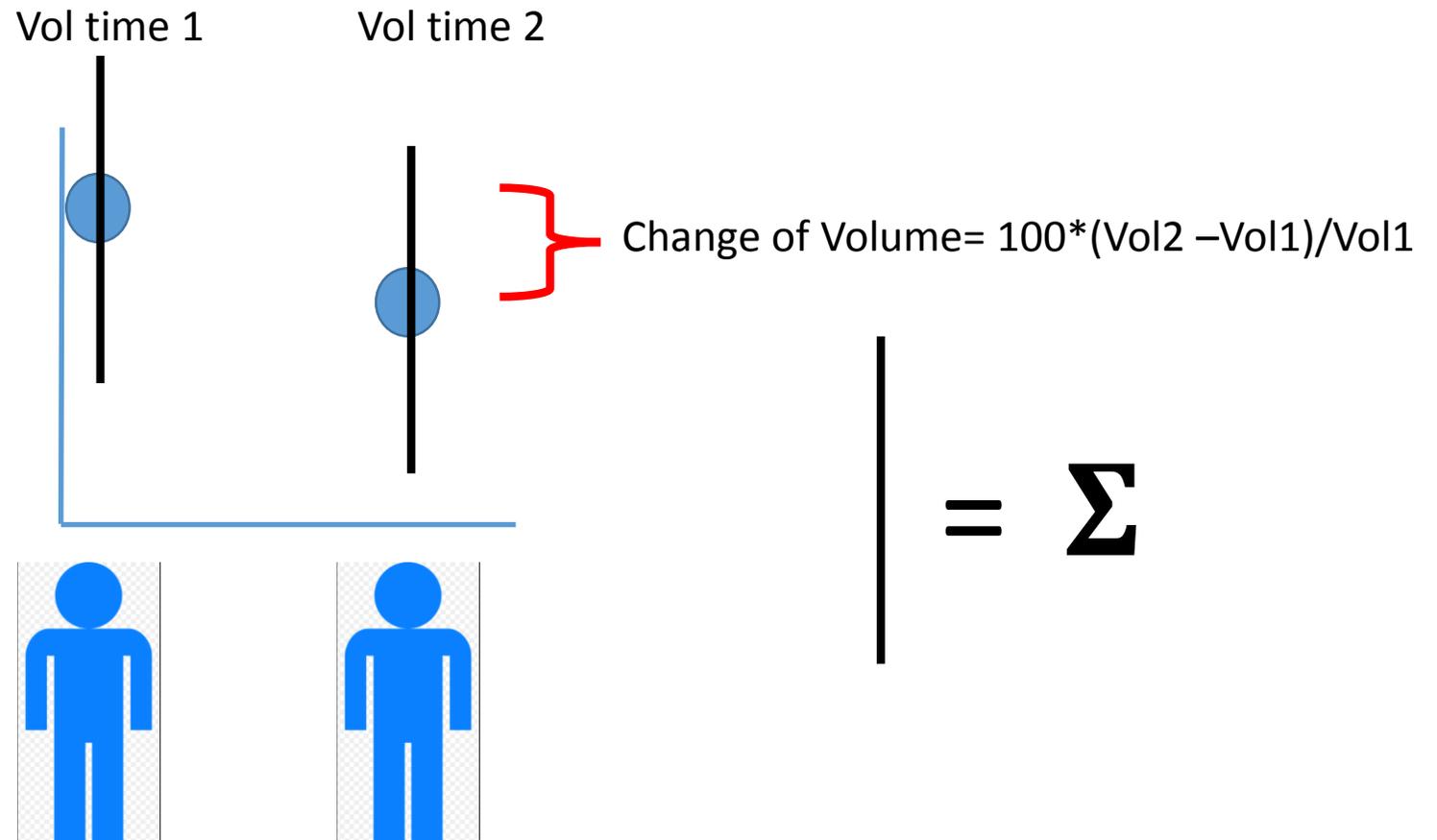
Quantification of a measure for MR images

Change of Volume = True atrophy + Σ



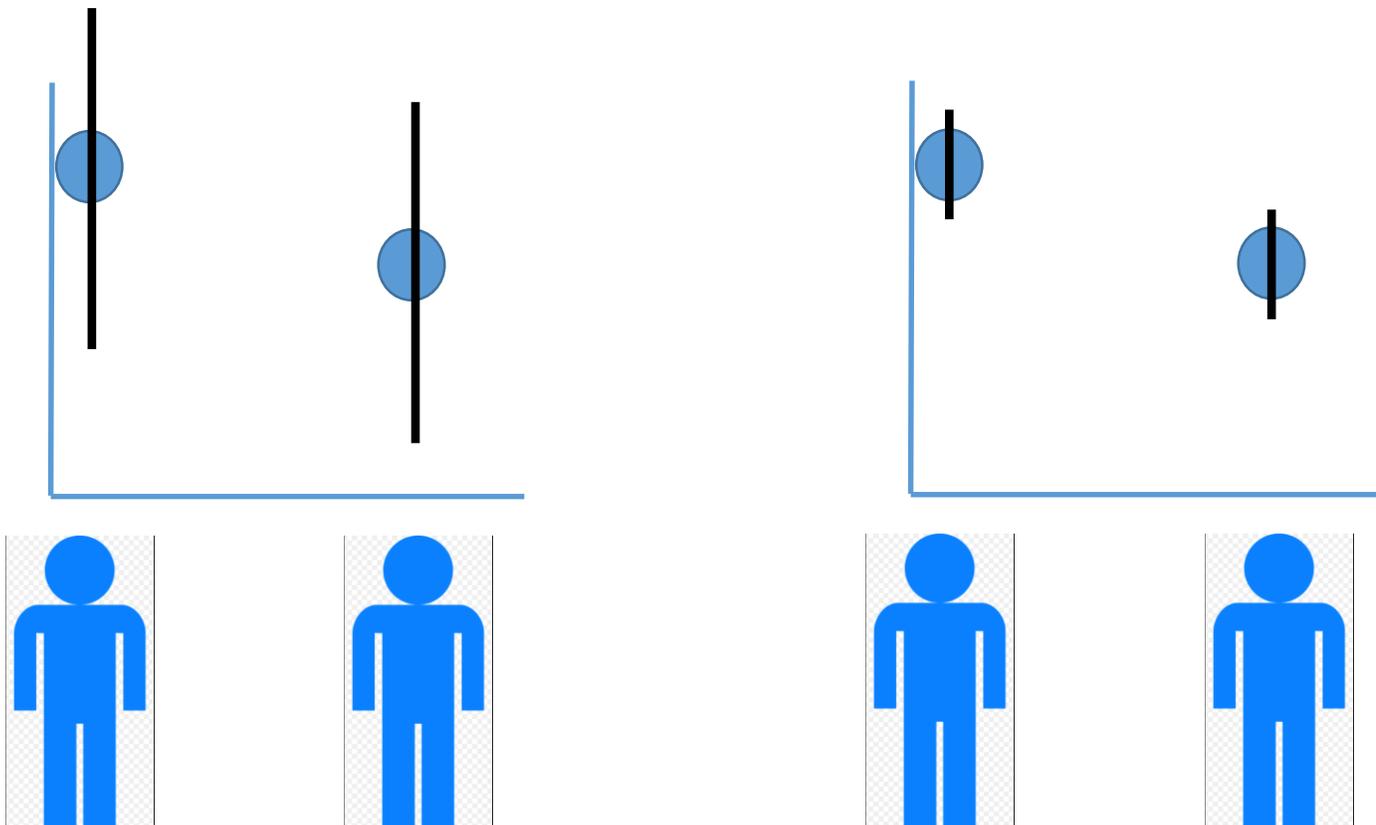
Quantification of a measure for MR images

Change of Volume = True atrophy + Σ



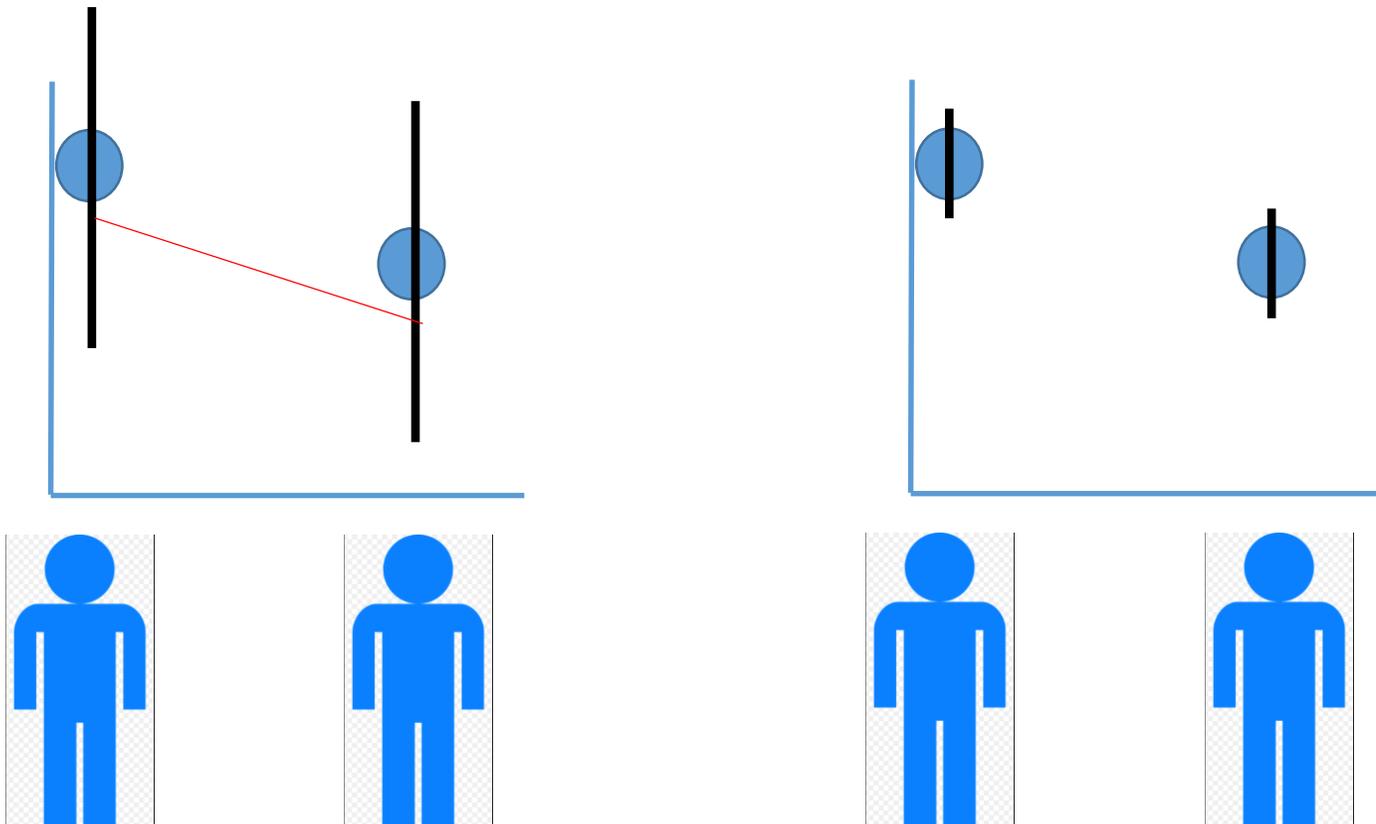
Quantification of a measure for MR images

Change of Volume = True atrophy + Σ



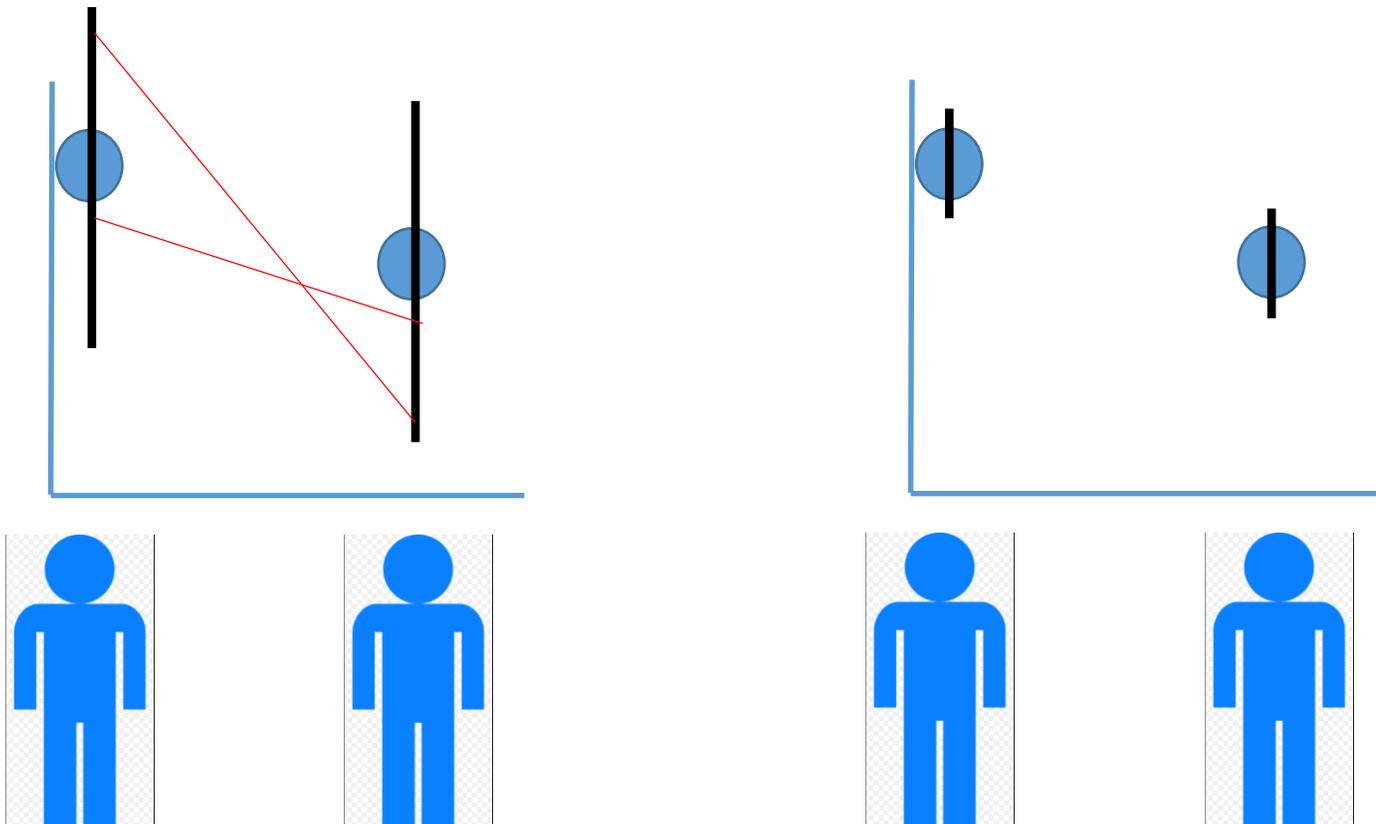
Quantification of a measure for MR images

Change of Volume = True atrophy + Σ



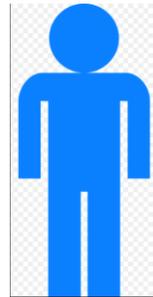
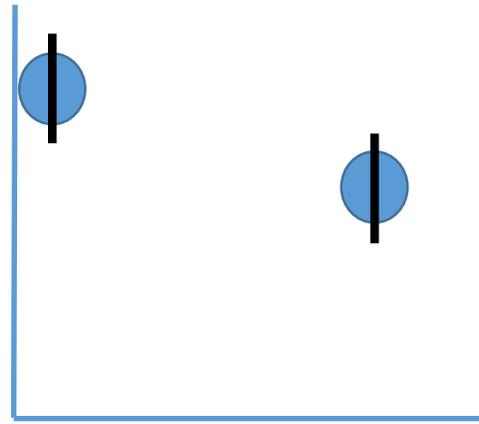
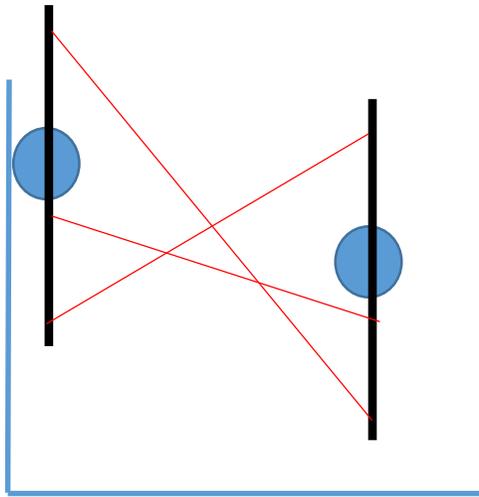
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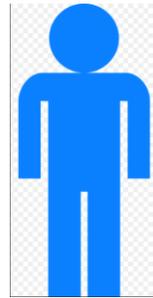
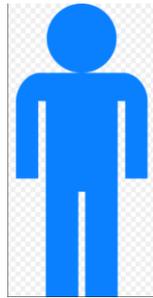
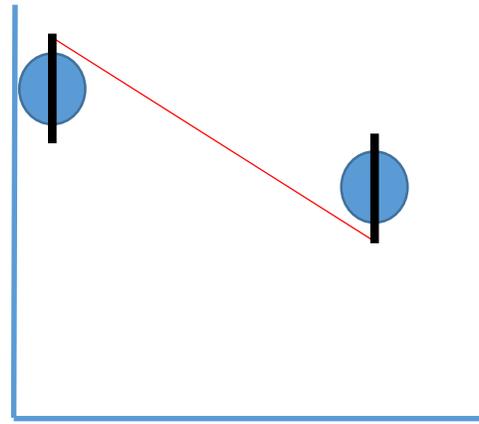
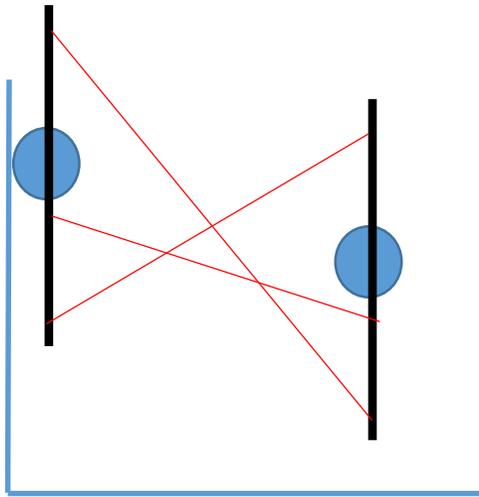
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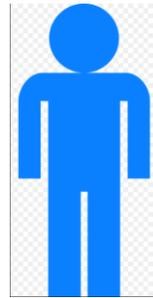
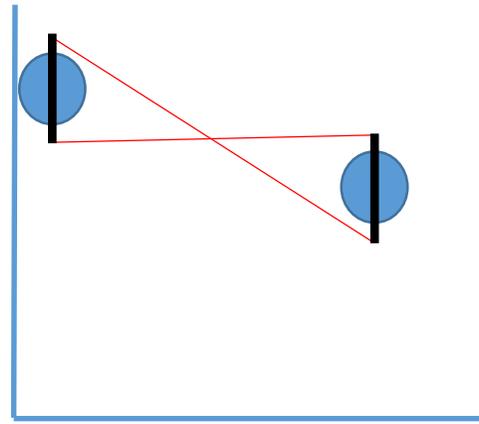
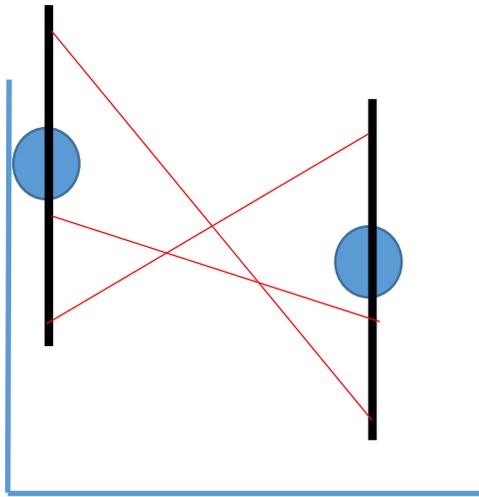
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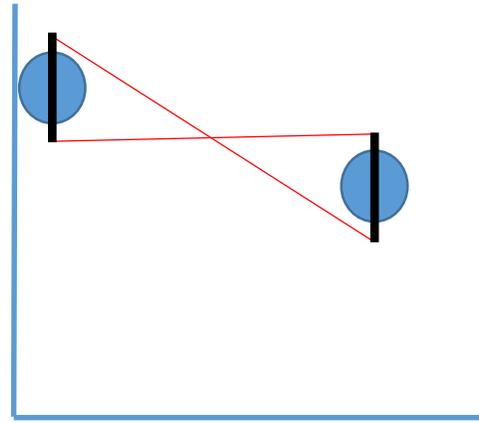
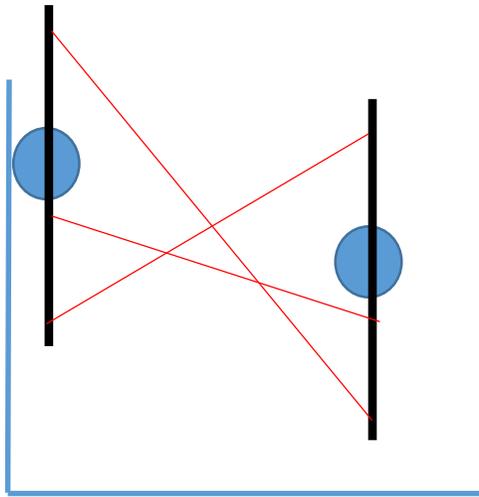
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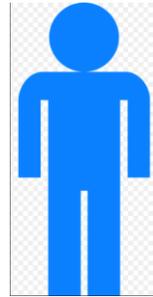
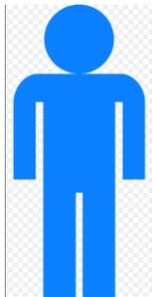


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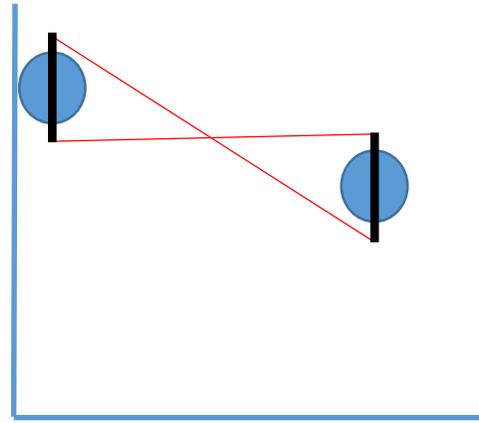
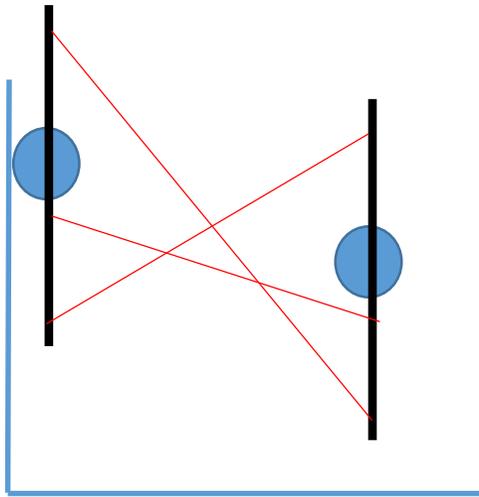


$$\frac{\text{Change of Volume}}{\Sigma}$$



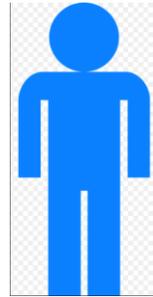
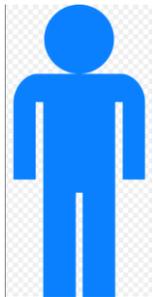
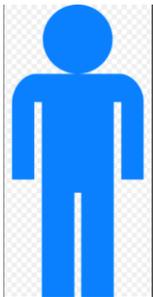
Quantification of a measure for MR images

Change of Volume = True atrophy + Σ



Change of Volume \uparrow

 Σ \downarrow



Quantification of a measure for MR images

$$\text{Change of Volume} = \text{True atrophy} + \Sigma$$

Change of Volume ↑

Increase the length of Follow-up