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### Graphical Abstract

# Virtual histology of Alzheimer's Disease: why are amyloid- $\beta$ plaques visible with X-ray phase-contrast imaging?

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### Highlights

# Virtual histology of Alzheimer's Disease: why are amyloid- $\beta$ plaques visible with X-ray phase-contrast imaging?

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- Amyloid- $\beta$  plaques in the different forms of Alzheimer's Disease have various contrasts in X-ray phase-contrast tomography
- In transgenic rodents, a core-restricted, positive contrast is driven by the level of metal entrapment within plaques
- In humans, greater and more diffuse metal accumulation lead to a positive contrast in a genetic case of AD

### Virtual histology of Alzheimer's Disease: why are amyloid-β plaques visible with X-ray phase-contrast imaging?

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#### Abstract

Amyloid- $\beta$  (A $\beta$ ) plaques from Alzheimer's Disease (AD) can be visualized *ex* vivo in label-free brain samples using synchrotron X-ray phase-contrast tomography (XPCT). However, for XPCT to be useful as a screening method for amyloid pathology, it is mandatory to understand which factors drive the detection of A $\beta$  plaques. The current study was designed to test the hypothesis that the A $\beta$ -related contrast in XPCT could be caused by the A $\beta$  fibrils and/or by metal entrapment within the A $\beta$  plaques. This study

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probed the fibrillar and elemental compositions of A $\beta$  plaques in brain samples from different types of AD patients and different AD animal models to establish a relationship between XPCT contrast and  $A\beta$  plaque characteristics. XPCT, micro-Fourier-Transform Infrared (µFTIR) spectroscopy and micro-X-Ray Fluorescence (µXRF) spectroscopy were conducted under synchrotron radiation on human samples (genetic and sporadic cases) and on four transgenic rodent strains (mouse: APPPS1, ArcAβ, J20; rat: TgF344). Aß plaques from the genetic AD patient were visible using XPCT, and had higher  $\beta$ -sheet content and higher metal levels than those from the sporadic AD patient, which remained undetected by XPCT. A $\beta$  plaques in J20 mice and TgF344 rats appeared hyperintense on XPCT images, while they were hypointense in the case of APPPS1 and ArcA $\beta$  mice. In all four transgenic strains,  $\beta$ -sheet content was similar, while metal levels were highly variable: J20 mice (zinc and iron), and TgF344 (copper) showed greater metal accumulation than APPPS1 and ArcA $\beta$  mice. In humans, the greater and more diffuse metal accumulation led to a positive contrast in the genetic case of AD. Hence, contrast formation of  $A\beta$  plaques in XPCT images depended mostly on biometal entrapment.

*Keywords:* Neurodegenerative diseases, Alzheimer's disease, Amyloid-β plaques, X-ray phase-contrast tomography, Fourier-Transform Infrared spectroscopy, X-Ray Fluorescence spectroscopy

#### 1. Introduction

Amyloid- $\beta$  (A $\beta$ ) plaques are an early hallmark of Alzheimer's Disease (AD) in the human brain [1]. A $\beta$  plaques are formed by the aggregation of amyloid- $\beta$  peptides with altered conformation into fibrils. Multiple techniques have arisen to assess the AD suspicion *in vivo*, especially A $\beta$  positron emission tomography (PET) [2]. However, definite AD diagnosis still requires the *postmortem* examination of brain tissue and neuropathological scorings like the CERAD scoring [3], which qualitatively assesses the density and distribution within the brain, and Thal–Braak stages [4], which describe the progression of A $\beta$  plaques within the brain areas.

X-ray phase-contrast tomography (XPCT) refers to a family of techniques which uses the phase shift rather than the attenuation of X-rays to probe the microstructure in soft biological tissues. X-ray 3D imaging of A $\beta$  plaques has been described in transgenic rodent models that develop amyloidosis for the past decade, using propagation-based phase contrast (either with synchrotron radiation [5, 6, 7, 8, 9, 10] or with a laboratory source [11]) or using gratingbased phase contrast (with synchrotron radiation [12, 13, 14, 5]). These techniques generate 3D images with an isotropic resolution ranging from 1 µm to 10 µm, thus providing a so-called "virtual histology" of the excised brain [6, 15, 16, 17, 18, 19] with minimal preparation (fixation, dehydration or paraffin embedding). Imaging AD samples with XPCT is particularly interesting because plaques stand out in the images without the need to add any staining agents. Previous studies highlighted the great potential of XPCT for the quantitative analysis of amyloid- $\beta$  plaques (overall burden [14, 5], spatial distribution [8], 3D morphometry [10]). These advances (which bring original information not available to standard immunohistochemistry), combined with increasingly faster acquisitions (less than 5 min per sample [10]), position XPCT as a potential screening tool for amyloid pathology. However, up to now, the substrate underlying contrast of A $\beta$  plaques in XPCT images remains unexplored. In other words, it is not known why  $A\beta$ plaques are detected with XPCT.

Phase-contrast signal emerges from local changes of the X-ray refractive index within the plaques — compared to that of the surrounding tissue —, which makes them stand out. Changes of the refractive index could be caused by the characteristics of the fibrils structured as  $\beta$ -sheet stacks of amyloid- $\beta$  peptides [20, 21, 22, 23, 24], which form dense and relatively insoluble aggregates. Or they could be linked to the entrapment of endogenous metals within the plaques, as iron, copper and zinc have been observed as co-localized with A $\beta$  plaques, both in the human pathology [20, 25] and in rodent models [26, 27, 28, 29]. We tested these two non-exclusive hypotheses to elucidate the origin of the phase-contrast signal of A $\beta$  plaques. To this end, we performed an examination of the same excised brains from a variety of transgenic rodents (four transgenic strains) and AD patients (one sporadic case and one familial case) with three different and complementary synchrotron techniques, namely:

- *i*) XPCT to visualize the plaques within the entire hemisphere (rodent) or the entire biopsy (human cortex) and measure the contrast with surrounding tissue,
- *ii*) Fourier-transform infrared microspectroscopy ( $\mu$ FTIR) to quantify the proportion of  $\beta$  sheets in the plaques,

*iii*) X-ray fluorescence microspectroscopy ( $\mu$ XRF) to assess metal quantities in the plaques.

We here report new XPCT contrasts related to  $A\beta$  plaques: in rodents, some strains displayed a hypointense (dark) contrast while others had the already described hyperintense (bright) contrast. In humans, XPCT highlighted parenchymal  $A\beta$  plaques for the first time (in the genetic patient). Overall our results suggest that XPCT contrast is mainly driven by the level and spatial distribution of metal entrapment.

#### 2. Material & Methods

Figure 1 summarizes study design, which intended to examine A $\beta$  plaques from the same samples, on one side with XPCT, and on the other side with µFTIR followed by µXRF. The list of samples, and all measurements performed on individual A $\beta$  plaques (n = 9-23 per strain), is available as a supplementary file.

#### 2.1. Samples

#### 2.1.1. Human brain samples

Human brain samples (from parietal and frontal cortex) and associated data were obtained from Tissu-Tumorothèque Est Biobank (CRB-HCL Hospices Civils de Lyon) authorized by the French Ministry of Research (authorizations DC2008-72 & AC2015-2576):

- A 51-year-old male patient with genetic (APP duplication) AD (postmortem delay 36 h);
- An 82-year-old female patient with sporadic AD (post-mortem delay 11 h).

Both had pronounced A $\beta$  pathology (Thal–Braak stage V, CERAD score 3), and had been previously diagnosed as free from prion disease.

For each selected region, a pair of snap-frozen samples was collected. One sample was kept frozen for sectioning, while the other was fixed with formaldehyde 4 % (as described in the tissue preparation section below).



Figure 1: Experimental design, summarizing sample preparation and imaging techniques. A half of the sample was fixed and dehydrated then scanned in 3D with XPCT (left part). The other half was sectioned while frozen, fluorescently stained to locate A $\beta$  plaques, and analyzed in 2D using µFTIR (for  $\beta$ -sheet load) and µXRF (for metal level).

#### 2.1.2. Transgenic rodent brain samples

Four transgenic rodent models that develop amyloidosis were studied:

- Mono-transgene line  $\operatorname{ArcA\beta}(n = 3 \text{ mice}, 15 \text{ months old})$ , with mutant APP [30] (https://www.alzforum.org/research-models/arcav)
- Double-transgene line APPPS1 (n = 3 mice, 12 months old), with mutant APP and PSEN1 [31] (https://www.alzforum.org/research-models/appps1)
- Mono-transgene line **J20** (*n* = 2 mice, 13 months old), with mutant APP [32] (https://www.alzforum.org/research-models/j20-pdgf-appswind)
- Double-transgene line TgF344 (n = 3 rats, 20 months old), with mutant APP and PSEN1 [33] (https://www.alzforum.org/research-models/tgf344-ad)

One wild-type (WT) rat (Fischer 344) and one WT mouse (C57Bl/6), respectively 20 and 15 months old, were used as controls.

Rodents were sacrificed with intracardiac PBS perfusion to clean blood vessels. Brains were excised and kept at -80 °C.

Mouse brains were cut in half along the hemisphere (Figure 1). One half was then fixed and dehydrated (for XPCT). The other half was immediately put back at -80 °C (for  $\mu$ FTIR and  $\mu$ XRF).

Only one hemisphere was available per rat brain. The hemispheres were cut in the middle of the hippocampus. One half was then fixed and dehydrated (for XPCT). The other half was immediately put back at -80 °C (for  $\mu$ FTIR and  $\mu$ XRF).

#### 2.1.3. Fixed tissue and dehydration

The unfrozen samples were fixed for 24 to 48 hours with 4% FA. Then they were dehydrated at RT in a series of 8 baths with a gradient of ethanol concentrations, diluted with PBS, for 5 minutes each: 25%, 25%, 50%, 50%, 75%, 75%, 96%, 96%. Finally, they were put into glass tubes filled with 96% ethanol and kept at 4 °C.

#### 2.1.4. Frozen tissue and preparation of SiRN membranes

The frozen samples were dissected into blocks in the hippocampus / upper cortex area, to ensure they would fit into an area of  $4 \times 4 \text{ mm}^2$ . Then they were sectioned along the coronal plane up to the hippocampus, using a Leica CM1850 cryostat at -20 °C with a thickness of 7 µm. PTFE-coated blades (DuraEdge<sup>TM</sup>, TedPella, Inc., USA) were used to prevent metallic contamination. Brain sections were placed with a paintbrush on 200 nm-thick silicon-rich nitride (SiRN) membranes (Silson Ltd, UK) with an inner frame side of 4 millimeters. Sections were stained for 5 minutes with a pan-amyloid fluorescent agent, p-FTAA [34] (1 µmol L<sup>-1</sup> in PBS with 0.01 % NaN3); membranes were then rinsed once with nanopure water. Fluorescence and bright-field transmission images were acquired with a ZEISS microscope (cf. Figure 2A). Afterwards, membranes were kept in a desiccator with silica gel blue (2 mm-4 mm, Roth) until synchrotron experiments (1-4 weeks after).

#### 2.2. Synchrotron experiments

All experiments, unless explicitly stated, were conducted at the synchrotron radiation facility SOLEIL, within the scope of the proposal #20200258.



Figure 2: Silicon-nitride membrane overview and 2D imaging with  $\mu$ FTIR and  $\mu$ XRF. (A) Sectioned samples were placed on SiRN membranes, fluorescently stained and imaged with a microscope with 2 channels: bright-field and green fluorescence. (B) During the experiment at the SMIS beamline, the fluorescence was used to target A $\beta$  plaques and multiple  $\mu$ FTIR spectra were acquired within individual plaques and in the surrounding tissue. (C) During the experiment at the NANOSCOPIUM beamline,  $\mu$ XRF hypermaps were acquired on the same A $\beta$  plaques — here shown as the sum over the whole spectrum.

#### 2.2.1. X-ray phase-contrast tomography (XPCT)

Formaldehyde-fixed, ethanol-dehydrated samples were imaged with X-ray phase-contrast tomography (XPCT) at the ANATOMIX beamline [35] with a pink beam of mean energy 22 keV and a detector pixel size of 6.5 µm. The detector system consisted of a lutetium aluminum garnet (LuAG, Lu<sub>3</sub>Al<sub>5</sub>O<sub>12</sub>) single-crystal scintillator (600 µm thick) coupled to a CMOS camera (Hamamatsu Orca Flash 4.0 V2, 2048 × 2048 pixels) via a 1 : 1 lens system consisting of two Hasselblad photo objectives (f = 100 mm) in tandem geometry.

For reconstruction using PyHST2 [36], we set the Paganin length parameter to 552 µm ( $\delta/\beta = 1525$ ). We used a motion blur correction algorithm and an unsharp mask filter ( $c_{unsharp} = 0.5$ ,  $\sigma_{unsharp} = 2$  px). Complete acquisition parameters are reported in Supplemental Table 1. Human samples were imaged at the ESRF, beamline ID-19, using similar technique and parameters, which were previously reported [19].

#### 2.2.2. XPCT image analysis

Ring artifacts were removed using an in-house tool implemented by the company NOVITOM (France; https://www.novitom.com/en/) [19]. Samples were isolated from the background (air, glass tube and ethanol) and rotated within the AMIRA 3D software (release 2021.1, Thermo Fisher Scientific, USA). A $\beta$  plaques were segmented semi-automatically using a random forest algorithm from the IPSDK software (Reactiv'IP, France; https://www.reactivip.com/). The generated masks were screened for false positive segmentations and ~ 20 plaques were selected, along with ROIs of the background. Signal intensity measurements — as a ratio of the mean intensities of the plaques and the mean intensities of the background ROIs — were retrieved with MorphoLibJ [37], an ImageJ plugin.

#### 2.2.3. Fourier-transform infra-red microspectroscopy ( $\mu$ FTIR)

The brain cryosections on the membranes (cf. Figure 2, panel B) were analyzed by synchrotron-radiation FTIR microspectroscopy with a Continuum XL microscope and a Thermo Nicolet 6700 bench at the SMIS beamline. The microscope was equipped with a fluorescence imaging setup and an halogen mercury lamp for excitation of the p-FTAA fluorescent probe that binds  $A\beta$ plaques.

Spectra on and around the spots of interest (respectively referred as "In" and "Out") were recorded between  $650 \text{ cm}^{-1}$  and  $4000 \text{ cm}^{-1}$  at  $4 \text{ cm}^{-1}$  in  $10 \times 10 \text{ µm}^2$  dual-aperture mode, using a Schwarzschild  $32 \times$  (NA 0.65) objective and a matching condenser; zero-padding enhanced resolution to  $0.5 \text{ cm}^{-1}$ . All parameters are shown in Supplemental Table 2. Spectra were pre-processed with the atmospheric suppression algorithm from OMNIC 9.2 (Thermo Fisher Scientific, USA) to remove water vapor contribution.

Besides, a few acquisitions were performed as evenly-spaced arrays ("maps") with a lower co-addition to scan larger areas on a few samples, especially those devoid of  $A\beta$  from the WT animals.

#### 2.2.4. $\mu$ FTIR spectral analysis

Spectra were processed using Quasar [38]. All the data were imported and processed with the same pipeline:

Cutting: The region from  $650 \,\mathrm{cm}^{-1}$  to  $800 \,\mathrm{cm}^{-1}$  was cut out because of high-frequency noise;

- Quality assessment: Spectra were thoroughly screened for Mie scattering artifacts indeed, Mie scattering is responsible for the shifting of the Amide I peak towards lower wave numbers and for its distortion, which leads to measurements that are easily mistaken for higher  $\beta$ -sheet content [39];
- Absorbance thresholding: MCT detectors have a limited range for linearity between 0.2 and 1.4, so spectra with a peak-to-peak amplitude outside this range were discarded;
- **Baseline correction:** A linear baseline correction was applied on the Amide I band, from  $1415 \text{ cm}^{-1}$  to  $1770 \text{ cm}^{-1}$ ;
- **Feature selection:** Absorbance values closest to  $1655 \text{ cm}^{-1}$  (non- $\beta$  sheets) and  $1630 \text{ cm}^{-1}$  ( $\beta$  sheets) [40] were used as features to compute a spectroscopic ratio for amyloid  $\beta$ -sheet content:  $\frac{A_{1630 \text{ cm}^{-1}}}{A_{1655 \text{ cm}^{-1}}}$

#### 2.2.5. X-ray fluorescence microscopy $(\mu XRF)$

The brain cryosections on the membranes (cf. Figure 2, panel C) were analyzed by x-ray fluorescence ( $\mu$ XRF) microscopy using the "CX3" custom bench at the NANOSCOPIUM beamline. Measures were performed on the same locations on the membranes as for  $\mu$ FTIR acquisitions (cf. § 2.2.3), through the method described in Appendix B. The inline optical bright-field microscope which is mounted on the beamline helped fine-tuning the position.

Three standard reference materials (SRMs) were also scanned: the SRM 1577c "bovine liver" and SRM 1832 (NIST, USA), along with the "RF" standard thin film (AXO DRESDEN GmbH, Germany).

#### 2.2.6. $\mu XRF$ elemental analysis

Spectra were processed using PyMca [41]. First, the raw spectral maps were summed to locate the plaques more precisely within the scanned field of view — from  $20 \times 20 \,\mu\text{m}^2$  to  $80 \times 80 \,\mu\text{m}^2$ . Regions of Interest (ROIs) were drawn at the location of each plaque.

Then, the measures on the three SRMs and on a blank SiRN membrane helped the calibration of the software — using the fundamental parameter method — and the batch-fitting tool computed the mass fraction maps for each element. Reported mass fractions in  $\mu g g^{-1}$  or "parts per million" (ppm) were obtained by averaging within the drawn ROI. One can easily retrieve the corresponding surface concentration: 10 ppm  $\approx 1 \text{ ng cm}^{-2}$ ; because

 $e_{dried\ tissue} \approx 1\,\mu\text{m}$  and  $\rho_{dried\ tissue} = 1.04\,\mathrm{g\,cm^{-3}}$  (the density of dried brain tissue reported by Stedman and Spyrou [42]).

#### 2.3. Statistics

Results are displayed as box plots which use the Tukey standards, i.e. the whiskers end at  $Q1 - 1.5 \times IQR$  and  $Q3 + 1.5 \times IQR$  (IQR is the interquartile range); values outside of  $[Q1 - 1.5 \times IQR; Q3 + 1.5 \times IQR]$  are represented as points; means are represented as crosses and medians as a wide line. Reported fold increases are computed between the means.

For  $\mu$ FTIR, one-way ANOVAs with Tukey's tests for multiple comparisons were performed separately for human data and rodent data. For  $\mu$ XRF and for XPCT intensities, the normality tests failed so a non-parametric Mann-Whitney test was performed for the human data and a Kruskal-Wallis test with Dunn's multiple comparison tests was performed for the rodent data.

#### 3. Results

# 3.1. Genetic and sporadic human AD samples exhibit different $A\beta$ contrasts in XPCT

On XPCT images (Figure 3), the multiple  $A\beta$  plaques from the genetic AD patient were clearly visible in grey matter, exhibiting a typical neuritic aspect (Figure 3A) and diameter around 50 µm. Other hyperintense structures were neuronal bodies and vessels with remaining blood clots. The presence of multiple  $A\beta$  plaques in this familial form of AD was especially striking when scrolling through the virtual sample. In contrast, parenchymal  $A\beta$  plaques from the sporadic AD patient could not be reliably visualized. Smaller and highly hyperintense structures were observed, presumably amylaceous bodies (Figure 3B).



Figure 3: Representative XPCT slices of brain tissue with  $A\beta$  plaques from a genetic (A) and a sporadic (B) cases of Alzheimer's Disease. Insets (a) are zoomed single-slice ROIs of the main views while insets (b) are maximum intensity projections (MIPs) of the same ROIs over 8 slices (52 µm). Other hyperdensities, smaller than  $A\beta$  plaques, are neuron soma, amylaceous bodies, and blood vessels (partially filled with blood clots). Scale bars equal 1 mm.

# 3.2. $\beta$ -sheet content and metal entrapment are strikingly enhanced in the genetic case compared to the sporadic case

As expected, the  $\beta$ -sheet content in the fluorescence-labelled plaques (Figure 4A) was higher than in the surrounding tissue for both patients (genetic AD: +50%; sporadic AD: +4%). Besides, the  $\beta$ -sheet content significatively differentiated A $\beta$  plaques between the genetic and sporadic AD patients (genetic AD: +55%; p = 0.0012).



Figure 4: (A) Amyloid  $\beta$ -sheet content and (B) metal levels within A $\beta$  plaques from Alzheimer's Disease patients.  $\beta$ -sheet content is computed from peak ratios on  $\mu$ FTIR spectra and averaged per plaque (n = 6 for each patient). Metal levels are obtained by peak fitting on  $\mu$ XRF hyperspectra and averaged within a ROI on a plaque (n = 4 for the genetic AD, n = 7 for the sporadic AD).

Levels of metals within A $\beta$  plaques (Figure 4B) were higher (iron: +109%; zinc: +97%; copper: +88%) for the genetic AD patient compared to the sporadic AD patient.

#### 3.3. Transgenic AD models exhibit a variety of $A\beta$ contrasts in XPCT

To further investigate the relationship between XPCT A $\beta$  contrast and A $\beta$  composition, we used 4 different transgenic rodent strains (Figure 5A): the J20 mice and the TgF344 rats had small hyperintense plaques (typically in the

> range  $\emptyset 25-30 \,\mu\text{m}$  for J20; and  $\emptyset 15-20 \,\mu\text{m}$  for TgF344) mostly seen in the hippocampus, while the APPPS1 and ArcA $\beta$  strains had numerous and large hypointense plaques (APPPS1:  $\emptyset 40-45 \,\mu\text{m}$ ; ArcA $\beta$ :  $\emptyset 45-60 \,\mu\text{m}$ ), which however frequently exhibited a hyperintense core (APPPS1:  $\emptyset 10-15 \,\mu\text{m}$ ; ArcA $\beta$ :  $\emptyset 15-20 \,\mu\text{m}$ ), and were mainly located in the cortex but also in the hippocampus. Signal intensity measurements from ~ 20 segmented plaques per sample are also shown in Figure 5B.



Figure 5: (A) XPCT slices of brain tissue with A $\beta$  plaques from transgenic rodents and (B) associated contrasts of A $\beta$  plaques. Insets are zoomed single-slice ROIs of the main views. Plaques from ArcA $\beta$  and APPPS1 mice are hypointense and mainly observed in the cortex. Plaques from J20 mice and TgF344 rats are hyperintense and mostly located in the hippocampus. Comparisons of signal-to-background ratio between hyperintense-plaque strains and hypointense-plaque strains yielded significant differences (p < 0.0001). Scale bars equal 100 µm.

#### 3.4. $\beta$ -sheet content is constant across transgenic strains while metal entrapment is highly variable

The  $\beta$ -sheet content (Figure 6A) was increased in fluorescently-labelled spots in the rodent brain slices (measurements "In" vs. "Out" of fluorescent A $\beta$  plaques: +37 % for APPPS1, +36 % for ArcA $\beta$ , +38 % for J20, +47 % for TgF344). The  $\beta$ -sheet content in the surrounding tissue ("Out") in transgenic animals was similar to the level in corresponding wild-type animals (APPPS1: +6%; ArcA $\beta$ : +2%; J20: +9%; TgF344: -6%).

All transgenic strains also had increased levels of iron, zinc and copper at the analyzed  $A\beta$  plaques compared to their wild-type counterparts. However,



Figure 6: (A) Amyloid  $\beta$ -sheet content and (B) metal levels within A $\beta$  plaques and in the surrounding tissue from transgenic rodents.  $\beta$ -sheet content is computed from peak ratios on  $\mu$ FTIR spectra and averaged per plaque (n = 9 - 20 plaques per strain). Metal levels are obtained by peak fitting on  $\mu$ XRF hyperspectra and averaged within a ROI on a plaque (n=4-17 plaques per strain).

 $\mu$ XRF-measured metal composition of the A $\beta$  plaques (Figure 6B) varied between the different strains. J20 mice had the highest levels of zinc and iron compared to the other strains (zinc: +583 % vs. WT; iron: +803 % vs. WT) and TgF344 rats had the highest level of copper (+770 % vs. WT). Meanwhile, APPPS1 mice had the lowest mean levels and ArcA $\beta$  mice had

intermediate levels.

#### 3.5. Comparison between human and rodent datasets

Figure 7 shows a qualitative comparison of the multimodal dataset obtained with XPCT,  $\mu$ FTIR and  $\mu$ XRF, between transgenic rodents and humans. XPCT (left row) highlighted 3 distinct types of A $\beta$  plaques: small hyperintense plaques in J20 mice and TgF344; larger, hypointense plaques in ArcA $\beta$  and APPPS1; and similarly large, but diffusely hyperintense plaques in the genetic case of AD. All types of plaques exhibited an increased level of  $\beta$ -sheet content which matched the fluorescence signal, as measured by  $\mu$ FTIR (central row), and which tended to be increased in the human case compared to animal models. The accumulation of endogenous metals (right row) was mainly restricted to the (hyperintense) core of the plaque in rodents, while it appeared consistently diffuse over the whole  $\mu$ XRF FOV in the human plaques.



Figure 7: Multimodal dataset obtained with the three techniques on A $\beta$  plaques. XPCT scans (left column) were acquired on an unsectioned sample, while  $\mu$ FTIR (center) &  $\mu$ XRF (right) hyperspectra were acquired on a paired, sectioned, sample. Inline brightfield microscopy was used to match the fields of view (FOVs) between  $\mu$ FTIR and  $\mu$ XRF. Representative measurements in the plaques are indicated with a red arrowhead ( $\mu$ FTIR) and red outline ( $\mu$ XRF), and plotted as plain lines. Measurements outside the plaques ( $\mu$ FTIR: acquired in fluorescence-free regions outside the shown FOVs;  $\mu$ XRF: orange outline) are plotted as dotted lines. In the case of  $\mu$ FTIR, a linear baseline correction was applied on the Amide I band, from 1415 cm<sup>-1</sup> to 1770 cm<sup>-1</sup>. In the case of  $\mu$ XRF, measurements were normalized with the K $_{\alpha}$  peak of argon (Ar). Scale bars equal 10  $\mu$ m.

#### 4. Discussion

The present study sought to provide a rationale for the detection for  $A\beta$  plaques with synchrotron X-ray phase-contrast tomography, through a correlative approach between the local contrast — or signal intensity — and the fibrillar (µFTIR) and elemental (µXRF) compositions. The experimental design relied on three imaging modalities, all available at synchrotron SOLEIL, and included brain samples from patients diagnosed with Alzheimer's Disease (AD) and transgenic rodents which developed amyloidosis. 2D correlative examination of A $\beta$  plaques through µFTIR and µXRF has been an active field of research for 15 years (e.g. [20, 26, 43, 44]), which constantly highlighted that local elevations of  $\beta$ -sheet content and metal trapping were concomitant features across a variety of AD specimens, including in cellular models [45]. However this is the first time that the composition of A $\beta$  plaques is linked with a 3D imaging method such as XPCT.

Using propagation-based imaging, now the most widely employed XPCT method for virtual histology of label-free samples, we made original observations. In animals, A $\beta$  plaques from the J20 mouse strain and the TgF344 rat strain appeared as small bright (hyperintense) spots, as already reported for these and for other transgenic models such as 3xTg [10], APP/PS1 [8, 10], TauPS2APP [5] and B6C3-Tg [13]. But surprisingly, A $\beta$  plaques in the newly imaged APPPS1 and ArcA $\beta$  mouse strains appeared as dark (hypointense) spots, with the largest plaques frequently exhibiting an hyperintense core. In humans, we confirmed previous observations that parenchymal  $A\beta$  plaques are usually not detected with XPCT, except rare deposits which were reported as calcified [17, 46]. However, we unveiled that  $A\beta$  contrast in the human samples is more pronounced in an inherited case of AD — of which the first XPCT images are reported here — compared to sporadic AD. This variable appearance of A $\beta$  aggregates is reminiscent of A $\beta$  polymorphism, which describes, both in animal models and in humans, the existence of subtypes of A $\beta$  plaques [47, 48, 49].

FTIR microspectroscopy can be used to quantify the  $\beta$ -sheet content in individual A $\beta$  plaques with exquisite sensitivity. Indeed, the ratio of the  $\beta$ sheet over non- $\beta$ -sheet frequencies is used as a surrogate for fibrillar content. A $\beta$  plaques were localized with a pan-amyloid fluorescent stain, and we found a relatively similar level of fibrils in all transgenic models (interquartile ranges of ratio were: 0.55–0.73 for APPPS1; 0.56–0.69 for ArcA $\beta$ ; 0.59–0.78 for J20; 0.65–0.80 for TgF344). Not surprinsingly, the genetic AD patient had

much higher levels of fibrils (interquartile ranges of ratio: 0.74-1.22) than the sporadic patient (0.54–0.60), probably due to the presence of more diffuse deposits in the sporadic case. Overall, these µFTIR results showed that the fibrillar content of A $\beta$  plaques is not the sole factor responsible for XPCT detection.

Multiple studies — based on X-ray fluorescence [27] or other methods like inductively coupled plasma mass spectrometry (ICP-MS) [50, 51] — have linked AD pathogenesis with a disruption of the metal homeostasis in the brain, and more specifically copper, iron and zinc. These endogenous metals, whether in ionic or non-ionic forms [25], are locally trapped in A $\beta$  plaques at the expense of the surrounding tissue [20]. The metal concentrations we detected in the human A $\beta$  plaques matched those from the seminal study by Lovell et al. [52]. As already observed, animal models had much lower metal quantities associated with  $A\beta$  plaques than humans [26, 53]. Importantly, copper, zinc and iron levels in the genetic patient were all significantly higher (2-fold increase) compared to the sporadic AD patient. In animals,  $A\beta$ plaques from each strain preferentially bound to different metals (elevated Zn and Fe in J20; elevated Cu in TgF344). It has already been reported that iron is dysregulated within the hippocampus of J20 mouse model of AD [54]. And some differences between mouse and rat hippocampus — particularly on copper accumulation [55] — may explain our results on copper-enriched plaques in the rat model compared to mouse strain.

Overall, the combination of XPCT,  $\mu$ FTIR and  $\mu$ XRF allows us to propose the following interpretations. In mouse models, A $\beta$  plaques form numerous well-defined, and clearly visible deposits on XPCT images. Elevated levels of metals, mainly restricted to a small core area on XRF maps, are associated with a positive signal (hyperintensity) detectable in all three strains on XPCT. Importantly, the brighter signals are detected in the strain with the highest level of metals (J20). However, a larger dark rim (hypointensity) extending this core is also detected in APPPS1 and ArcA $\beta$ , while absent in J20. A $\beta$  fibrils, which match the fluorescence area and exceed the core area, cannot explain this difference as similar levels of fibrils were measured with  $\mu$ FTIR. Other factors, such as structural [49] or proteomic [56] differences between strains, might play a role.

In the transgenic rat, the pathology develops more slowly. Few plaques, representing only a subset of the global amyloid burden, are indeed detected with XPCT, as small hyperintense spots. In contrasts, amyloid fluorescence was widely detected in hippocampus, which pointed to a spatially widespread

pathology (Supplemental Figure 1). In line with this, additional  $\mu$ FTIR mapping experiments performed at ALBA synchrotron (beamline MIRAS), showed a global and unimodal increase in fibrillar content (Supplemental Figure 2), suggesting a diffuse accumulation of fibrils in the entire hippocampus. This implies that the few, large fluorescent areas that were targeted in our  $\mu$ FTIR/ $\mu$ XRF experiments, are likely to be biased and maybe not be entirely representative of the pathology. Nevertheless, if we assume that the largest fluorescent plaques are the ones that give rise to XPCT detection, the high amounts of copper highlighted by  $\mu$ XRF specifically in this model, are consistent with the results from mouse models, and could explain the bright appearance, restricted to the core of A $\beta$  plaques in XPCT.

In humans, our data from two patients are obviously insufficient to disentangle the combined effect of  $\beta$ -sheet level and metal entrapment, which both drastically increased in the inherited case vs. sporadic one. However, the strikingly diffuse pattern of metal entrapment observed in XRF (in comparison to rodent models, Figure 7) seems consistent with the detection of hyperintense plaques on XPCT images. More samples would be needed to understand the local contrast in different types of A $\beta$  plaques (diffuse, neuritic) which could not be properly discriminated here. Tau pathology, which is present in human samples in the form of neurofibrillary tangles (and potentially associated with microcalcifications [57]), but lacking in the rodent strains studied here, could also contribute to the XPCT contrast, as it was recently shown in a triple-transgenic mouse model [58]. It is nevertheless remarkable that A $\beta$  plaques from the genetic case display a detectable XPCT contrast, and this observation deserves further confirmation in other familial cases of AD.

In conclusion, XPCT has attracted increasing interest in neuroscience these last years for its ability to provide valuable microstructural characterization (myelin, vessels, neuron density, protein deposits) in excised, intact, brain samples. XPCT can now be acquired in a few minutes at various resolutions, enabling a virtual dissection from the organ-level to the (sub-)cellular level. Indeed, high-resolution scans of whole organs are now possible as recently demonstrated by the particularly impressive 3D imaging of a full human brain [59]. The present report reinforces the potential of XPCT to capture key aspects of the A $\beta$  pathology. However, if XPCT is envisioned as a potential screening method for A $\beta$  pathology in brain samples, it is crucial to understand which factors drive the detection of some and not all A $\beta$  plaques. This study was specifically designed to tackle this question, and highlighted

> sharp XPCT differences in  $A\beta$  pathology, which were related to the different levels of metals locally bound to  $A\beta$  plaques. This model-specific, dyshomeostasis of endogenous metals might be a downstream consequence of the genetic alterations, and could be region-specific or depend on the disease stage of progression. Additional factors, other than the overall  $\beta$ -sheet content, are likely to contribute to the XPCT contrast and remain to be identified.

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# Authors' contributions (according to Contributor Role Taxonomy (CRediT))

- Conceptualization: FC
- Methodology: EB, SB, FC
- Resources: CS, TW, TD, DM, TB (APPPS1), JK (ArcAβ), NR (J20), HB (TgF344), CO, EB, SB
- Investigation: MC, CS, TW, TD, CO, MW, EB, SB
- Formal analysis: MC, CS, SS, SB
- Data curation: MC, CS, SB
- Software:
- Visualization: MC, FC
- Validation: MC
- Supervision: CS, EB, SB, FC
- Project administration: FC
- Funding acquisition: FC
- Writing original draft: MC, FC
- Writing review & editing: CS, TW, TD, JK, MW, EB, FC

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Numerical parameter		Value	Unit
Undulator gap		11.7	mm
Exposure time per projection		200	$\mathbf{ms}$
Gold filter thickness		20	$\mu m$
Detector-to-sample distance		113	cm
Number of projections (1	180°)	2000	
	360°)	2600	
$\delta/\beta$ for Paganin filtering		1525	
Weight of unsharp mask filter		0.5	
Radius of unsharp mask filter		2	$\mathbf{p}\mathbf{x}$

#### Appendix A. Extra parameters for synchrotron experiments

Supplemental Table 1: Acquisition and reconstruction parameters for XPCT (ANATOMIX)

Parameter	Value
Mode	Dual aperture
Apodization	Strong Norton & Beer
Objective type	Schwarzschild
Numerical parameter	Value Unit
Spectral resolution	$4  cm^{-1}$
Zero-fill factor	2
Aperture size	$10 \times 10$ cm <sup>2</sup>
Co-addition	256
Objective numerical aperture	0.65
Objective magnification	32

Supplemental Table 2: Acquisition parameters for FTIR (SMIS)

#### Appendix B. Scanning the same positions on SMIS and NANO-SCOPIUM

Scanning the same positions on SMIS and NANOSCOPIUM was crucial to associate the FTIR and XRF measures. However, beamtimes were two weeks apart and required different sample holders and orientations. To overcome this challenge, two coordinate systems  $\mathcal{S} := (O, A, B, C)_{FTIR}$  and  $\mathcal{S}' := (O, A, B, C)_{XRF}$  were created using the inner corners of the membrane, so that the new points  $p'_i(x'_i, y'_i)$  were obtained from  $p_i(x_i, y_i)$  by solving

$$\begin{bmatrix} -x_{O} & -y_{O} & -1 & 0 & 0 & 0 & x_{O}x'_{O} & y_{O}x'_{O} & x'_{O} \\ 0 & 0 & 0 & -x_{O} & -y_{O} & -1 & x_{O}y'_{O} & y_{O}y'_{O} & y'_{O} \\ -x_{A} & -y_{A} & -1 & 0 & 0 & 0 & x_{A}x'_{A} & y_{A}x'_{A} & x'_{A} \\ 0 & 0 & 0 & -x_{A} & -y_{A} & -1 & x_{A}y'_{A} & y_{A}y'_{A} & y'_{A} \\ -x_{B} & -y_{B} & -1 & 0 & 0 & 0 & x_{B}x'_{B} & y_{B}x'_{B} & x'_{B} \\ 0 & 0 & 0 & -x_{B} & -y_{B} & -1 & x_{B}y'_{B} & y_{B}y'_{B} & y'_{B} \\ -x_{C} & -y_{C} & -1 & 0 & 0 & 0 & x_{C}x'_{C} & y_{C}x'_{C} & x'_{C} \\ 0 & 0 & 0 & -x_{C} & -y_{C} & -1 & x_{C}y'_{C} & y_{C}y'_{C} & y'_{C} \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} h_{1} \\ h_{2} \\ h_{3} \\ h_{4} \\ h_{5} \\ h_{6} \\ h_{7} \\ h_{8} \\ h_{9} \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 1 \\ \end{bmatrix}$$

$$(B.1)$$

then

$$\begin{bmatrix} x_i'/\lambda \\ y_i'/\lambda \\ \lambda \end{bmatrix} = \overbrace{\begin{bmatrix} h_1 & h_2 & h_3 \\ h_4 & h_5 & h_6 \\ h_7 & h_8 & h_9 \end{bmatrix}}^H \begin{bmatrix} x_i \\ y_i \\ 1 \end{bmatrix}$$
(B.2)

where H is the homography matrix and  $\lambda$  is a factor.



Supplemental Figure 1: Fluorescence microscopy images of p-FTAA-stained sections of a TgF344 rat brain (A) and a J20 mouse brain (B), near hippocampus (shown with dotted line). Both sections were acquired with the same exposure time and rendered with the same value range. One can notice the p-FTAA staining reveals more diffuse structures in the rat brain. Scale bars equal 1000 µm.

#### Appendix C. Measures at ALBA synchrotron (Barcelona, Spain)

Large-field FTIR images were obtained using a  $64 \times 64$  px full-field focal plane array (FPA) detector cooled with liquid nitrogen. Images were taken by FPA detector on areas of  $210 \times 210 \,\mu\text{m}^2$  with 128 accumulated spectra per point at 8 cm<sup>-1</sup> spectral resolution and 10 µm pixel size. The spectra were background-corrected using extracellular regions close to the tissue. From each IR image, the total absorbance cartogram was generated by integrating at specific peaks in amide I area ( $1600 \,\text{cm}^{-1}$ – $1700 \,\text{cm}^{-1}$ ), i.e. the ratio of peaks characteristic for  $\beta$ -sheet structures absorbing at  $1625 \,\text{cm}^{-1}$  and  $\alpha$ -helix structures assigned at  $1655 \,\text{cm}^{-1}$  (Supplemental Figure 2).



Supplemental Figure 2: (A) FPA-FTIR maps of the  $\beta$ -sheet content within the hippocampus and (B) measures from TgF344 rats (Tg #1 and Tg #2) and a wild-type rat (WT), acquired at ALBA synchrotron. Mean and standard deviation of Tg #1: 0.508 ± 0.041; Tg #2: 0.523 ± 0.078; WT: 0.494 ± 0.026. Scale bars equal 50 µm.