

● *Original Contribution*

THE IMAGING MODULOGRAPHY TECHNIQUE REVISITED FOR HIGH-DEFINITION INTRAVASCULAR ULTRASOUND: THEORETICAL FRAMEWORK

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Abstract—Mechanical characterization of atherosclerotic lesions remains an essential step for the detection of vulnerable plaques (VPs). Recently, an intravascular ultrasound (IVUS) elasticity reconstruction method (iMOD) has been tested *in vivo* by our group. The major limitation of iMOD is the need to estimate the strain field in the entire VP despite attenuated depth penetration signals when using high-definition (HD) IVUS systems. Therefore, an extended iMOD approach (E-iMOD) was designed and applied to coronary lesions of patients imaged *in vivo* with IVUS. The E-iMOD method (i) quantified necrotic core areas with a mean absolute relative error of $3.5 \pm 3.5\%$ and (ii) identified Young's moduli of the necrotic cores and fibrous regions with mean values of 5.7 ± 0.8 kPa and 794.5 ± 22.0 kPa instead of 5 kPa and 800 kPa, respectively. This study demonstrates the potential of the improved HD-IVUS modulography technique E-iMOD to characterize coronary VPs. (E-mail: jacques.ohayon@imag.fr) © 2016 World Federation for Ultrasound in Medicine & Biology.

Key Words: Elastography, Modulography, Linear elasticity, Inverse problem, Vulnerable plaques, Coronary disease.

INTRODUCTION

Atherosclerotic coronary plaque rupture and subsequent thrombosis is the leading cause of acute coronary syndrome and responsible for the majority of cardiovascular deaths (Fleg et al. 2012; Go et al. 2013; Lloyd-Jones et al. 2010). Vulnerable plaques (VPs; plaques likely to rupture) possess specific geometrical (Virmani et al. 2006), mechanical (Cheng et al. 1993; Loree et al. 1992; Ohayon et al. 2001; Riou et al. 2014) and biological (Broisat et al. 2011) features. An early and accurate determination of these properties remains an essential step to implementing preventive therapeutic strategies (Libby 2001).

Studies have shown that fibrous cap thickness index ($<65 \mu\text{m}$) alone is not a sufficient predictor of plaque rupture (Cardoso et al. 2014; Ohayon et al. 2008; Virmani et al. 2000). Biomechanical studies have identified peak cap stress (PCS) amplitude as an additional key predictor of plaque disruption (Finet et al. 2004; Ohayon et al. 2014). *In vivo* imaging modalities are needed to characterize and identify specific biomechanical factors responsible for plaque instability and rupture (Fleg et al. 2012; Magnoni et al. 2015). Following the spirit of Ophir and colleagues (Céspedes et al. 1993; Ophir et al. 1991), several intravascular ultrasound (IVUS) strain-elastography (de Korte et al. 2002; Maurice et al. 2004; Richards and Doyley 2013) and strain-palpography (Céspedes et al. 2000; Deleaval et al. 2013; Schaar et al. 2005) reconstruction techniques were developed to characterize atherosclerotic coronary lesions and to predict their vulnerability to rupture. IVUS

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strain-elasticity approaches were developed to highlight the spatial strain distribution (*i.e.*, strain-elasticity) over the entire vessel wall (Keshavarz-Motamed et al. 2014; Majdoulina et al. 2014; Maurice et al. 2007; Richards and Doyley 2013) or over a restricted thick endoluminal region (de Korte et al. 2002; Doyley et al. 2001). Such IVUS imaging techniques based on the optical flow (Keshavarz-Motamed et al. 2014; Majdoulina et al. 2014; Maurice et al. 2004), time-delay correlation estimation (de Korte et al. 2002) or a non-rigid image-registration method (Richards and Doyley 2013) allowed the calculations of intraplaque strain images during the cardiac cycle. However, these methods did not overcome the main limitation related to the complex morphologies of atherosclerotic lesions, which alter the intraplaque strain fields and inhibit direct translation into intra-parietal stress and plaque mechanical properties.

Young's modulus reconstruction of atherosclerotic plaque (*i.e.*, modulogram), based on the strain field measurements, remains a challenge that has been pursued by a variety of methods (Baldewing et al. 2008; Doyley 2012; Le Floc'h et al. 2009). Following the spirit of Baldewing et al. (2005) and Doyley's works (Doyley 2012; Richards and Doyley 2011), our group (Bouvier et al. 2013; Le Floc'h et al. 2009, 2010, 2012) demonstrated that by pre-conditioning the algorithm based on the best estimation of plaque component boundaries, we could improve the elasticity reconstruction. An original pre-conditioning step to extract the plaque morphology and an iterative approach combining a dynamic watershed segmentation method with an optimization procedure were proposed to highlight modulograms of human coronary atherosclerotic lesions (this approach was named iMOD for imaging modulography; Le Floc'h et al. 2012). However, one major limitation of such a method is the need to estimate accurately the strain field in the entire lesion. This may be difficult as the amplitude of the original signal becomes attenuated as the depth of penetration increases and shadow artifacts produced by calcified nodules impair imaging of deep plaque structures. Strain-elasticity maps are also difficult to reconstruct when using intravascular imaging techniques with limited depth penetration signals, such as optical coherence tomography (OCT) or the new generation of high-definition intravascular ultrasound (HD-IVUS) imaging systems equipped with high-frequency catheters ≥ 60 MHz (Kobayashi et al. 2014; Waters et al. 2011).

Therefore, the present biomechanical study was designed to extend the theoretical framework of the iMOD technique when considering HD-IVUS catheters with limited depth penetration. This extended iMOD technique (E-iMOD), based on the continuum mechanics theory describing the strain field in the limited endoluminal region,

was successfully applied to 10 VP morphologies: three modeled plaque geometries and seven coronary lesions of patients imaged *in vivo* with IVUS. The robustness and performance of the new elasticity reconstruction technique E-iMOD was investigated with regard to noise, which may affect prediction of plaque vulnerability.

MATERIALS AND METHODS

To test the numerical performance of the proposed E-iMOD algorithm, the finite element (FE) method was used to generate our input set of the intraplaque displacement and strain fields. As realistic human VP geometries were needed to perform the FE simulations, we used VP geometries of patients imaged *in vivo* with an IVUS system operating at 40 MHz. To simulate the acquisitions that we would obtain with limited depth penetration HD-IVUS catheters, the resulting FE displacement and strain fields computed in the endoluminal plaque regions and the luminal contours were the only inputs of our inverse model. Let us notice that the plaque component's contours were not given to solve the inverse problem.

IVUS study and plaque geometries

To study the performance of the proposed E-iMOD method, we used a patient population including five plaque geometries considered in a previous work conducted by our group on the elasticity-palpography technique (Deleaval et al. 2013). This will allow us also to discuss the complementarities of these two approaches when applied to the same VP morphologies.

Patient population. Arteries were explored in seven patients with stable angina and referred for percutaneous coronary intervention (PCI) at the Hospital of Cardiology and Pneumology of Lyon. Investigations were approved by institutional board of the hospital's cardiology department, and consent was obtained from the patients.

Intravascular ultrasound imaging. The dataset of non-ruptured VP geometries was obtained from systematic IVUS scans of the left main, left anterior descending and left circumflex coronary arteries following the protocol described by Rioufol et al. (2002). The recorded cross-sectional IVUS images corresponded to the sites exhibiting the thinner fibroatheroma cap. An iLab IVUS system (Boston Scientific, Watertown, MA, USA) equipped with 40-MHz catheters (Atlantis SR Pro 3.6F, Boston Scientific) was used for these clinical investigations.

IVUS image analysis. The IVUS echogenicity aspects were used to characterize atherosclerotic VP components. Anechogenic, homogeneous reflective and bright zones indicate presence of lipid or cellular deposition, organized or disorganized fibrosis and calcified regions, respectively (Di Mario et al. 1998). A manual

segmentation procedure using ImageJ software (ImageJ, National Institutes of Health, Bethesda, MD, USA) was performed by a cardiologist to extract the contours of each plaque component. Coronary geometric configurations of atherosclerotic lesions acquired from this patient population were used to initiate our FE analysis.

IVUS measurements and definitions. Each cross-sectional IVUS image of a lesion was quantitatively analyzed. Measurements were made for plaque area (Pla_{area} , mm²); lumen area (Lu_{area} , mm²); necrotic core area ($Core_{area}$, mm²); calcified area (Cal_{area} , mm²); degree of stenosis ($Stenos_{deg}$, %), defined as $100 \times Pla_{area}/(Pla_{area} + Lu_{area})$; and cap thickness (Cap_{thick} , mm), defined as the shortest distance between the lumen and the necrotic core.

Idealized plaque geometries. In addition to the initial data set of VPs acquired on patients by IVUS, idealized eccentric VP geometries were drawn to obtain a series of VP geometries mimicking the plaque evolution. From one real plaque geometry acquired on a patient by IVUS (Fig. 1, plaque #3), three idealized models mimicking the plaque evolution by increasing Cap_{thick} and decreasing the necrotic core size were designed by a cardiologist (Fig. 1, plaques #M1 to M3).

Forward problem: Endoluminal displacement and radial strain fields

The digitized contours obtained with ImageJ were imported into MATLAB (The MathWorks, Natick, MA, USA) and then transferred in the FE software COMSOL (Structural Mechanics Module, version 3.5, COMSOL Inc., Grenoble, France) via the LiveLink MATLAB/Comsol toolbox. The mechanical properties of the fibrous regions, calcified inclusions and soft necrotic cores were modelled as isotropic (Williamson *et al.* 2003) and quasi-incompressible media (Poisson's ratio $\nu = 0.49$) with Young's moduli $E_{fibrosis} = 800$ kPa, $E_{calcified} = 5000$ kPa and $E_{core} = 5$ kPa, respectively (Finet *et al.* 2004). Displacement and radial strain distributions were obtained by performing static FE computations on all VP geometries. The plane strain condition was assumed because only one 2-D IVUS image of the cross-sectional section with a large stenosis was acquired in routine imaging on each patient during the clinical protocol. As instantaneous pressure was not recorded during the IVUS scans of the coronary arteries, a realistic pressure gradient ΔP of 1 kPa (or 7.5 mm Hg) occurring between two successive IVUS images was assumed (Le Floc'h *et al.* 2012). The entire plaque geometries were meshed with approximately 20,000 6-Node triangular elements. The center of mass of the lumen was used as the origin of the cylindrical coordinate system (r, θ). The computed displacement and radial strain

fields were interpolated on a regular polar mesh with a given radial step resolution of 15.4 μm and an angular step resolution of 256 radial directions, which is the resolution one can expect from IVUS (Maurice *et al.* 2007). To simulate the acquisitions conducted with limited depth penetration IVUS catheters, the performance of the proposed elasticity reconstruction method E-iMOD was tested with displacement and strain fields computed in the endoluminal plaque regions Ω_{endo} only. For this study, we called them abusively "measured" displacement vector and strain fields (\vec{u}^{meas} and ϵ_{rr}^{meas}).

Inverse problem: Governing equations and elasticity reconstruction method

The endoluminal domain Ω_{endo} was assumed to be isotropic, heterogeneous and quasi-incompressible (Poisson's ratio $\nu = 0.49$) and was described by the linear elastic Hooke's law:

$$[\sigma] = \frac{E(\vec{x})}{(1+\nu)} \left(\frac{\nu}{(1-2\nu)} Trace[\epsilon][I] + [\epsilon] \right) \text{ in } \Omega_{endo} \quad (1)$$

where $[\sigma]$ and $[\epsilon]$ are the stress and strain tensors, respectively; $[I]$ is the identity matrix; and E the Young's modulus, which is an arbitrary function of the position vector \vec{x} .

Assuming quasi-static condition and neglecting gravity and inertial forces, the stress tensor $[\sigma]$ satisfies the local static equilibrium equation:

$$\nabla \cdot [\sigma] = \vec{0} \quad \text{in } \Omega_{endo} \quad (2)$$

Assuming plane strain condition, the mathematical problem is correctly defined because the boundary conditions, at the inner ($\partial\Omega_{endo}^{in}$) and outer ($\partial\Omega_{endo}^{out}$) limits of the endoluminal domain Ω_{endo} (see Fig. 1, row 2), are given in terms of imposed stress and displacement. A blood pressure was imposed at the entire luminal limit ($\partial\Omega_{endo}^{in}$) of the endoluminal domain of interest. At the free outer limit ($\partial\Omega_{endo}^{out-Plaque}$) of this domain of interest, a zero pressure was assumed, while at the intraplaque outer limit ($\partial\Omega_{endo}^{out-Plaque}$) of the endoluminal domain, displacement was imposed. Such boundary conditions are realistic because (i) the intraplaque displacement field could be estimated by using the robust IVUS-Lagrangian speckle model estimator (Maurice *et al.* 2004) and (ii) the blood pressure could be recorded during the IVUS scans. A blood pressure of amplitude ΔP (equal to 1 kPa) was applied on the inner boundary $\partial\Omega_{endo}^{in}$:

$$[\sigma] \vec{n} = -\Delta P \vec{n} \quad \text{on } \partial\Omega_{endo}^{in} \quad (3)$$

where \vec{n} is the external unit vector normal to the contour $\partial\Omega_{endo}^{in}$. Knowing the displacement field in the entire

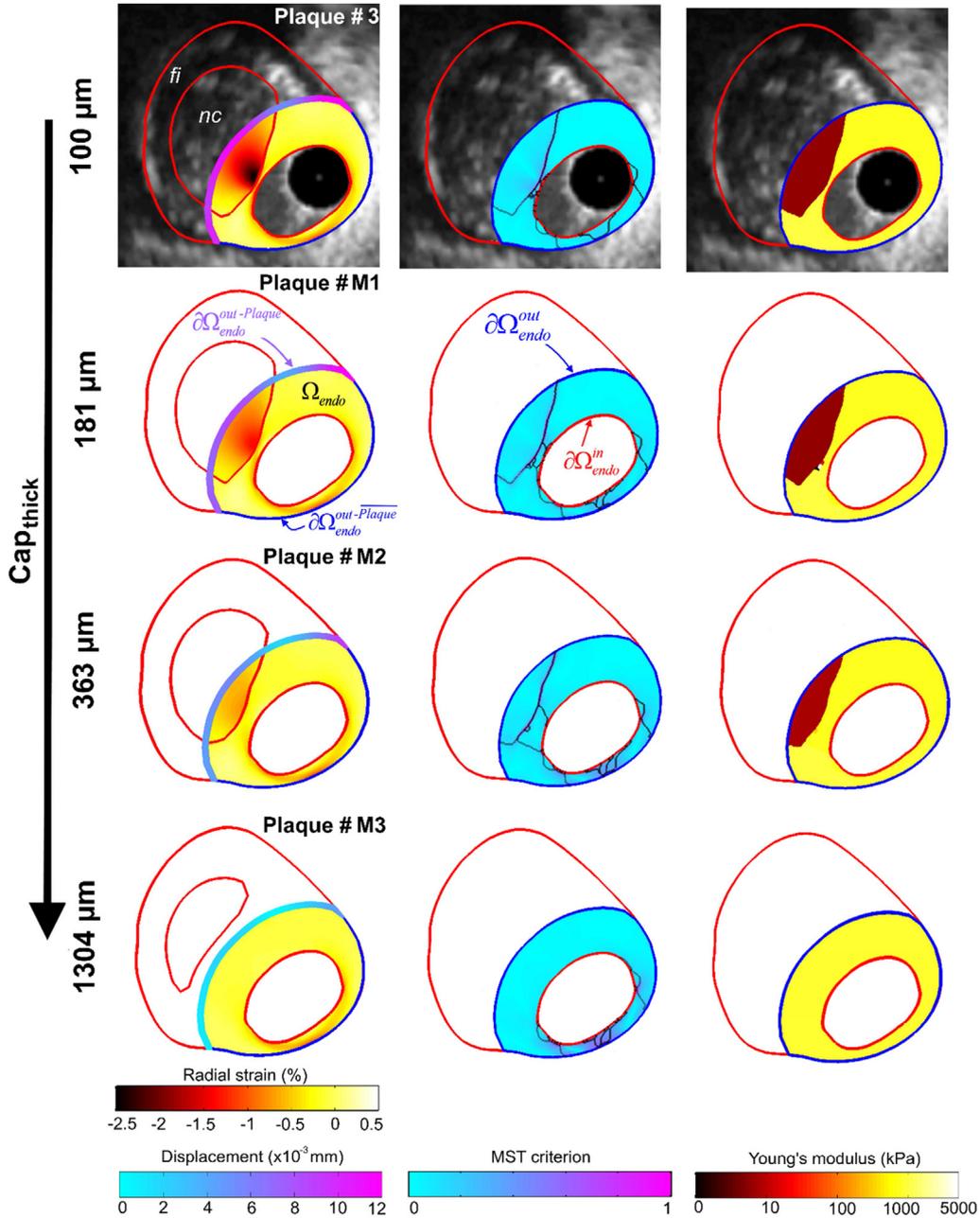


Fig. 1. Performance of the E-iMOD method to estimate cap thickness and to detect a vulnerable plaque when only a part of the large necrotic core is included in the endoluminal plaque domain Ω_{endo} . Plaques #3 and M1 to M3 were used for these simulations. **Column 1:** Input radial strain-elastogram and amplitude of the displacement vector applied on the intraplaque outer endoluminal boundary $\partial\Omega_{endo}^{out-Plaque}$. **Column 2:** Spatial distribution of the normalized modified Sumi's transform (MST) criterion dW (see Eq. [5]) and the extracted inclusions contours ($n = 20$) obtained from the combined MST-DWS procedure. **Column 3:** Resulting Young's modulus maps (*i.e.* modulograms) of the endoluminal region. *Red lines* delimit inclusions, lumen and external plaque contours. The *blue lines* delimit the endoluminal plaque domain Ω_{endo} of internal and external boundaries $\partial\Omega_{endo}^{in}$ and $\partial\Omega_{endo}^{out}$, respectively. *nc* = necrotic core. *fi* = fibrous region. The forward problem was conducted with fibrosis and necrotic core Young's moduli equal to 800 kPa and 5 kPa, respectively.

endoluminal region Ω_{endo} , we can express the following displacement-condition at the intraplaque outer endoluminal boundary $\partial\Omega_{endo}^{out-Plaque}$:

$$\vec{u} = \vec{u}_0^{meas} \quad \text{on } \partial\Omega_{endo}^{out-Plaque} \quad (4a)$$

where \vec{u}_0^{meas} is a known displacement vector field. The remaining complementary endoluminal boundary $\partial\Omega_{endo}^{out-Plaque}$ is assumed to be free of stress:

$$[\sigma] \vec{n} = \vec{0} \quad \text{on } \partial\Omega_{endo}^{out-Plaque} \quad (4b)$$

where $\partial\Omega_{endo}^{out} = \partial\Omega_{endo}^{out-Plaque} \cup \partial\Omega_{endo}^{out-Plaque}$.

The theoretical frameworks of the segmentation technique and the mathematical optimization procedure used have been described earlier (Le Floc'h *et al.* 2009). Briefly, considering two successive frames (at time t_{j-1} and t_j) of the IVUS sequence, we applied the extended imaging modulography technique E-iMOD, which involves three successive steps: (i) the computation of a local pseudo-gradient elasticity amplitude dW computed on the defined regular polar mesh:

$$dW = -\frac{1}{\varepsilon_{rr}} \left(\frac{\partial\varepsilon_{rr}}{\partial r} + \frac{2\varepsilon_{rr}}{r} \right) dr - \frac{1}{\varepsilon_{rr}} \frac{\partial\varepsilon_{rr}}{\partial\theta} d\theta \quad (5)$$

(this equation from here on is referred to as the ‘‘Modified Sumi’s Transform’’ (MST) criterion); (ii) the dynamic watershed segmentation (DWS) procedure that makes use of the previous step’s results to extract the inclusions’ contours; and finally (iii) the mathematical optimization procedure that provides the estimated Young’s moduli of detected inclusions and surrounding tissue. This last step relies on using the adjoint method to estimate, in the endoluminal domain Ω_{endo} , the gradient of the normalized root mean squared error (RMS_{error}) between the measured ε_{rr}^{meas} , u_r^{meas} , u_θ^{meas} and computed $\varepsilon_{rr}^{E-iMOD}$, u_r^{E-iMOD} , u_θ^{E-iMOD} radial strains, and radial and circumferential displacements, respectively:

$$RMS_{error}(t_j) = \sqrt{\sum_{k=1}^3 \sum_{elt=1}^N \Delta S_{elt}^2 (\chi_{k,elt}^{mean} - \chi_{k,elt}^{E-iMOD})^2 / (\chi_k^{mean})^2} \quad (6a)$$

$$\text{with } \chi_k^{mean} = \sum_{elt=1}^N \Delta S_{elt} \chi_{k,elt}^{meas} \quad (6b)$$

where N is the total number of finite elements, ΔS_{elt} is the area of FE elt and $\chi_k = \varepsilon_{rr}, u_r, u_\theta$ for $k = 1, 2, 3$,

respectively. The watershed (Watershed function, Imaging ToolBox, MATLAB, version 7.6, the MathWorks) and minimization procedures (Optimization Lab Module, COMSOL, version 3.5, COMSOL Inc.) were repeated with an increasing number n of pre-conditioning regions to take into account smaller heterogeneity sizes. We assumed that a satisfactory solution was reached when the gradient-based optimization procedure reached a tolerance termination value lower than 10^{-6} . During the optimization procedure, local Young’s moduli were constrained to remain positive and between 1 kPa and 10^4 kPa.

Sensitivity study with regards to noise on input radial strain and displacement data

To investigate the influence of the noise on the performance of the new E-iMOD algorithm, white noise was added to each FE simulated radial strain and displacement fields used as input. A normal distribution of noise with zero mean and a standard deviation of $(a\Psi + b)\beta$, where Ψ is either the radial displacement, circumferential displacement or radial strain, was used (Baldewsing *et al.* 2005; Le Floc'h *et al.* 2009). Values of factors a and b were fixed to 0.2% and 0.04%, respectively, to obtain significant noise levels. The noise field was significantly amplified by increasing β from 1 to 6. For each level of noise, 20 computations in which the noise was spatially randomly distributed were performed and the reconstructed averaged Young’s modulus constituents, necrotic core area and Cap_{thick} amplitudes (\pm standard deviations) of one VP were presented. We converted our white noise amplitude in dB scale based on the definition of the signal-to-noise ratio (see Appendix II of Deleaval *et al.* 2013).

Unless otherwise stated, all numerical results presented in our figures were derived (i) from measured radial strain ε_{rr}^{meas} and displacement vector \vec{u}^{meas} fields with no white noise (*i.e.*, with $\beta = 0$), (ii)

Table 1. Characteristics of the entire atherosclerotic plaques detected by intravascular ultrasound (IVUS) and modeled. To test the E-iMOD’s performance, cap thicknesses were randomly assigned (value in parentheses) when found to be under the limit of resolution obtained with the 40-MHz IVUS catheter (*i.e.*, $<90 \mu\text{m}$)

	Origin of geometry	Cap thickness (μm)	Area (mm^2)					Stenosis (%)
			First necrotic core	Second necrotic core	Calcified	Plaque	Lumen	
Plaque 2	IVUS	93	1.36	-	-	8.74	2.79	76
Plaque 3	IVUS	100	5.39	-	-	16.70	3.24	84
Plaque M1	Model	181	5.14	-	-	16.70	3.24	84
Plaque M2	Model	363	4.68	-	-	16.70	3.24	84
Plaque M3	Model	1304	2.57	-	-	16.70	3.24	84
Plaque 4	IVUS	162	0.51	1.20	-	17.85	6.75	73
Plaque 5	IVUS	<90 (41)	2.11	-	0.40	17.53	3.60	83
Plaque 6	IVUS	<90 (62)	3.54	-	1.60	15.64	4.52	78
Plaque 8	IVUS	<90 (52)	1.34	0.44	-	15.06	5.72	72
Plaque 9	IVUS	<90 (50)	0.87	-	-	8.74	3.74	70

with a blood pressure differential ΔP of 1 kPa, (iii) by using the objective function defined previously in Eq. (6) with $k = 1, 2, 3$ and (iv) by performing the MST-DWS procedure to extract the inclusions' contours.

RESULTS

IVUS study

Table 1 provides the geometrical characteristics of the seven non-ruptured VPs scanned *in vivo* (plaques #2, 3 and 9 are three VPs without calcification but with one necrotic core; plaques #4 and 8 are two VPs without calcification but with two necrotic cores; and plaques #5 and 6 are two VPs with one necrotic core and one

calcified inclusion) and the three modeled VPs (plaques #M1 to M3) mimicking the lesion's growth.

Influence of the displacement boundary condition on plaque elasticity reconstruction

To highlight the importance of considering all displacement components to express the boundary condition at the intraplaque outer endoluminal frontier $\partial\Omega_{endo}^{out-Plaque}$, we compared the modulograms computed when using all displacement components u_r and u_θ with those computed when considering only u_r . To distinguish the error induced by the imposed boundary condition, the inverse problem simulations were conducted with real VP morphologies and with only ϵ_{rr}^{meas} . We found that the estimated Young's moduli of all necrotic cores and fibrous

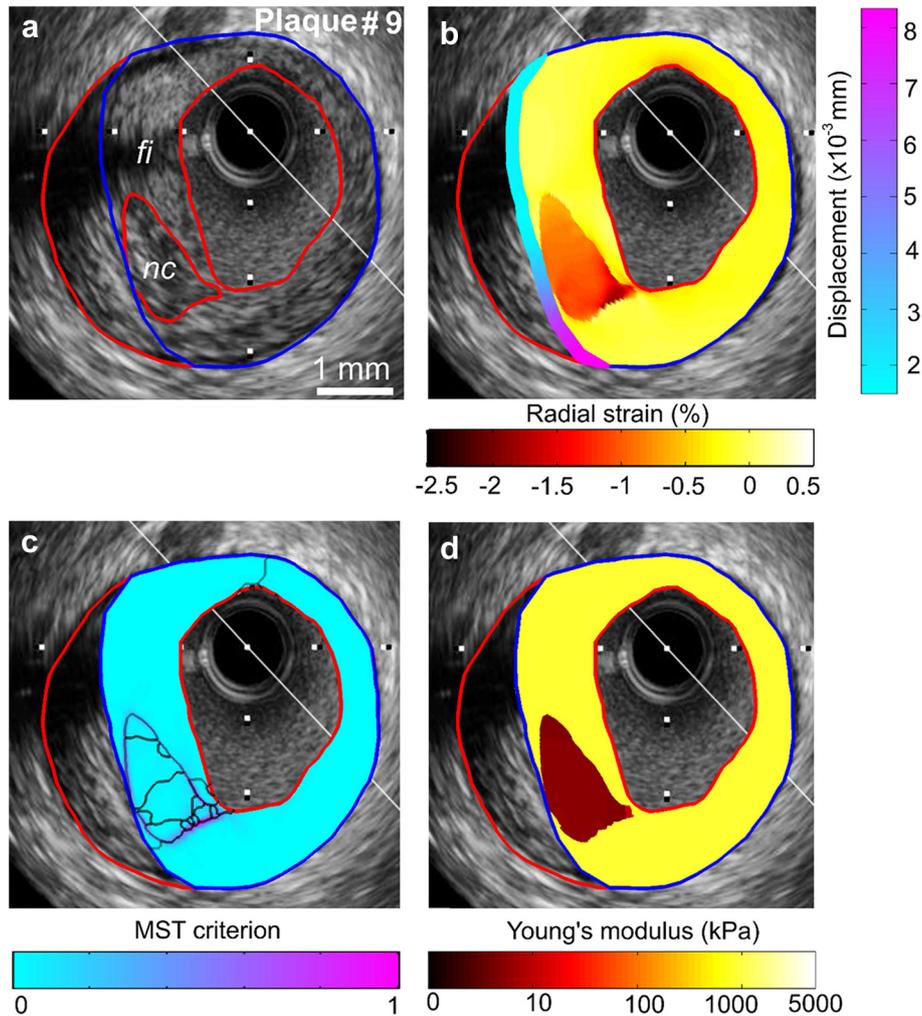


Fig. 2. Performance of the E-iMOD technique to detect a vulnerable plaque when the whole necrotic core is included in the endoluminal plaque domain. (a) Intravascular ultrasound image of plaque #9 where red lines delimit necrotic core inclusion, lumen and external plaque contours. The blue contour delimits the endoluminal plaque domain. (b) Radial strain-elongogram and amplitude of the displacement vector applied on the intraplaque outer endoluminal boundary. (c) Spatial distribution of the normalized modified Sumi's transform (MST) criterion and the extracted inclusions contours ($n = 20$) obtained from the combined MST-DWS procedure. (d) Resulting plaque morphology and modulogram.

regions deteriorated significantly from 4.93 ± 0.68 kPa and 784.72 ± 15.97 kPa when considering both components to 16.06 ± 14.67 kPa and 782.61 ± 227.31 kPa when considering only the radial displacement, instead of expected values of 5 kPa and 800 kPa, respectively (results not shown).

Performance of the E-iMOD method to detect VPs with soft inclusions

Modulograms obtained for VPs with one necrotic core (plaques #3, 9 and M1 to M3, Figs. 1 and 2) and two necrotic cores (plaques #4 and 8, Figs. 3 and 4) are presented. Despite the fact that the necrotic cores were not entirely included in the endoluminal region of interest Ω_{endo} , the E-iMOD technique was able to detect the structure (plaques #3, M1 and M2, Fig. 1). While the Young’s modulus of the fibrous region was accurately identified

(computed mean value of 794.47 ± 21.97 kPa for a theoretical value equal to 800 kPa, Table 2), the stiffness of the soft inclusions was slightly overestimated (computed mean values of 5.67 ± 0.82 kPa instead 5 kPa, Table 2).

Performance of the E-iMOD method to detect VPs with calcified inclusions

For the highly heterogeneous VPs with calcified inclusions (plaques #5 and 6, Figs. 5 and 6), the E-iMOD technique detected and differentiated the soft and hard inclusions. Figure 5 illustrates the abilities of the proposed E-iMOD technique to characterize a complex VP (plaque #5) with adjacent soft and hard inclusions located between 2 and 4 o’clock and between 4 and 5 o’clock, respectively. The mean Young’s modulus amplitude of the calcified inclusion was underestimated by a factor 1.5 (Table 2).

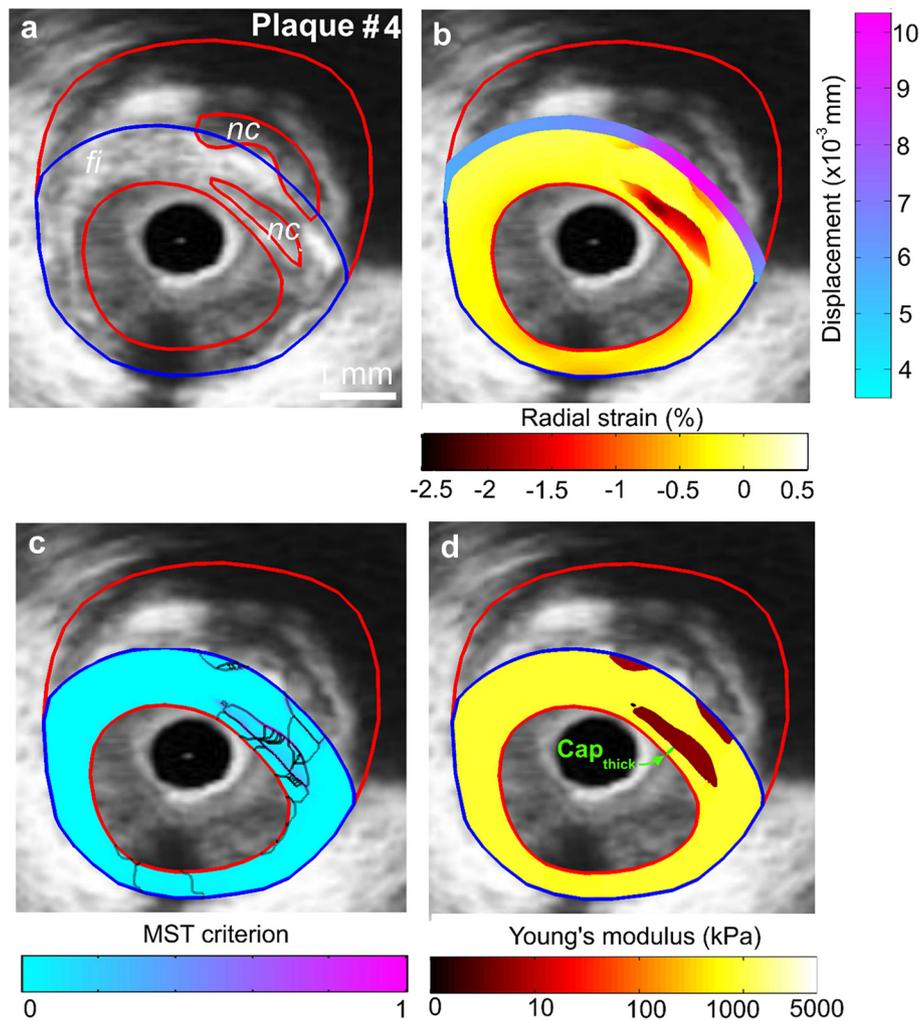


Fig. 3. Performance of the E-iMOD technique to detect a vulnerable plaque with two distant necrotic cores. (a) Intra-vascular ultrasound image of plaque #4 with plaque constituents (*red contours*). (b) Radial strain- elastogram and displacement applied on the intraplaque outer endoluminal boundary. (c) Spatial distribution of the normalized MST criterion and extracted inclusions contours ($n = 40$). (d) Computed modulogram. nc = necrotic core; fi = fibrous region.

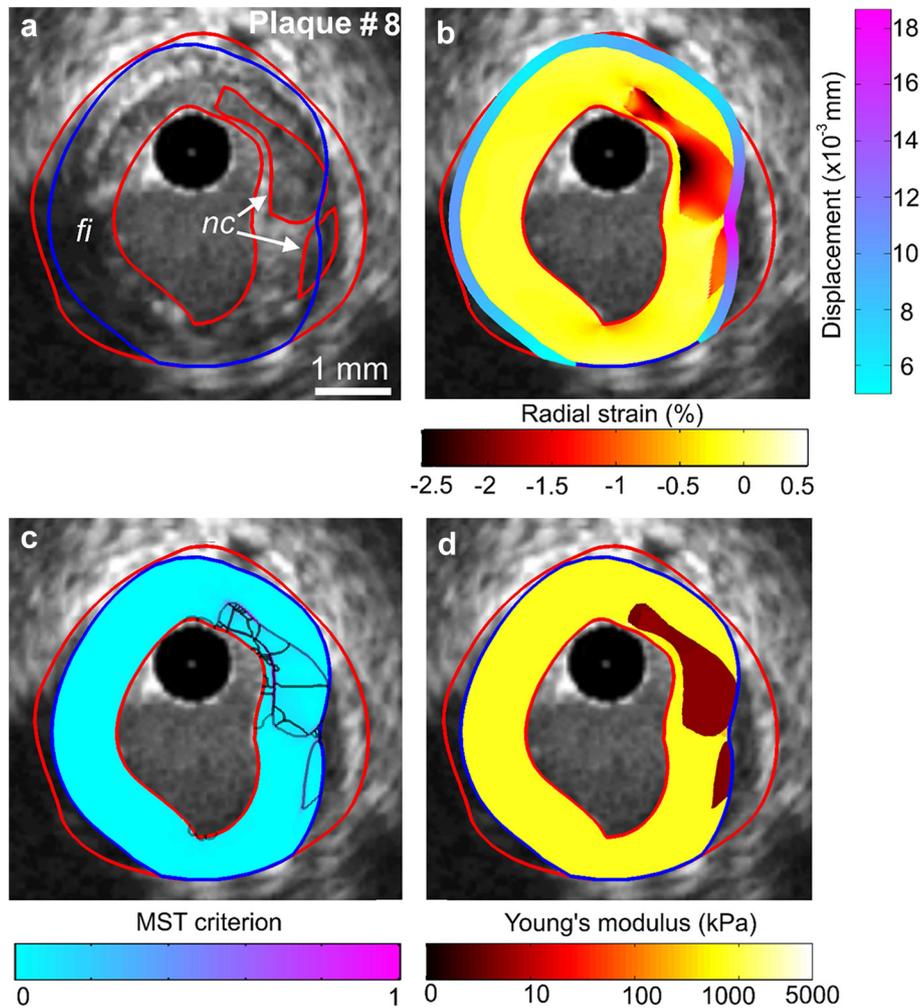


Fig. 4. Performance of the E-iMOD technique to detect a vulnerable plaque with two neighboring necrotic cores. (a) Intravascular ultrasound image of plaque #8 with plaque constituents (*red contours*). (b) Radial strain- elastogram and displacement applied on the intraplaque outer endoluminal boundary. (c) Spatial distribution of the normalized MST criterion and extracted inclusions contours ($n = 40$). (d) Computed modulogram. nc = necrotic core; fi = fibrous region.

Influence of the objective function and MST-DWS segmentation procedure on plaque elasticity reconstruction

To test the performance of the proposed RMS_{error} function (*i.e.*, with $\chi_{k=1,2,3} = \epsilon_{rr}, u_r, u_\theta$ in Eq. [6]) on elasticity map reconstructions, we compared the modulograms computed by using such objective function with those obtained when considering either only $\chi_{k=1,2} = \epsilon_{rr}, u_r$ or only $\chi_{k=1} = \epsilon_{rr}$ in the RMS_{error} formulation Eq. (6). By performing our simulations with real plaque morphologies, we found that the mean Young's moduli of all necrotic cores and fibrous regions varied slightly from 4.95 ± 0.64 kPa and 789.39 ± 8.53 kPa when considering the RMS_{error} function with $(\epsilon_{rr}, u_r, u_\theta)$ to 5.06 ± 0.76 kPa and 789.82 ± 10.25 kPa when considering the RMS_{error} function with (ϵ_{rr}, u_r) and to 4.93 ± 0.68 kPa and 784.72 ± 15.97 kPa

when using the RMS_{error} function with (ϵ_{rr}) , instead of expected values of 5 kPa and 800 kPa, respectively (results not shown). However, by using the inclusions' contours extracted from the MST-DWS procedure, we found that the mean Young's moduli of all necrotic cores and fibrous regions varied from 5.67 ± 0.82 kPa and 794.47 ± 21.97 kPa when considering the $RMS_{error}(\epsilon_{rr}, u_r, u_\theta)$ to 5.96 ± 1.53 kPa and 788.16 ± 34.53 kPa when considering the $RMS_{error}(\epsilon_{rr}, u_r)$ and to 5.93 ± 1.65 kPa and 788.73 ± 41.02 kPa when using the $RMS_{error}(\epsilon_{rr})$, respectively (only results obtained with the objective function $RMS_{error}(\epsilon_{rr}, u_r, u_\theta)$ are presented in Table 2). We can thus conclude that using only radial displacement and deformation, which are components that are easier to measure with real IVUS data sets, one could obtain acceptable modulograms.

Table 2. Analysis of the performance of the proposed elasticity reconstruction method E-iMOD. Comparisons between computed and real plaque cap thickness (Cap_{thick}), necrotic core area in the endoluminal region of interest Ω_{endo} ($Area_{core}$) and Young's moduli are presented. E_{core} , $E_{fibrosis}$ and $E_{calcified}$ are the Young's moduli of the necrotic core, fibrous region and calcified inclusion, respectively

	E_{core} (kPa)	$Area_{core}$ (mm ²)			$E_{fibrosis}$ (kPa)	$E_{calcified}$ (kPa)	Cap thickness (μ m)		
	[Real = 5 kPa]	Computed	Real	Relative error	[Real = 800 kPa]	[Real = 5 kPa]	Computed	Real	Relative error
Plaque #2	5.03 ± 0.08	1.35	1.36	-0.7%	798.07 ± 25.53	-	91	93	-2.7%
Plaque #3	5.67	1.64	1.65	-0.6%	805.30 ± 83.11	-	84	100	-16.2%
Plaque #M1	6.05 ± 0.57	1.42	1.43	-0.7%	825.75 ± 99.48	-	160	181	-11.6%
Plaque #M2	7.65	1.02	1.00	2.0%	792.50 ± 79.86	-	360	363	-0.8%
Plaque #M3	-	-	-	-	792.25 ± 16.88	-	-	1304	-
Plaque #4									
Core 1	4.99 ± 0.28	0.45	0.51	-11.8%	791.67 ± 38.96	-	147	162	-8.7%
Core 2	6.09 ± 1.44	0.23	0.22	4.5%					
Plaque #5	6.32 ± 0.93	0.94	0.99	-5.1%	820.14 ± 180.43	2 180 ± 500	68	41	64.6%
Plaque #6	5.15 ± 1.54	2.72	2.92	-6.8%	752.57 ± 496.98	4 430 ± 29.1	32	62	-47.6%
Plaque #8									
Core 1	5.26 ± 0.33	1.31	1.32	-0.8%	766.66 ± 40.96	-	49	52	-6.1%
Core 2	4.87	0.22	0.23	-4.3%					
Plaque 9	5.33 ± 0.71	0.86	0.87	-1.1%	799.82 ± 13.55	-	57	50	14.2%
Mean ± SD	5.67 ± 0.82	-	-	-	794.47 ± 21.97	3301.28 ± 1591.14	-	-	-

SD = standard deviation.

Performance of the E-iMOD method to quantify cap thickness amplitudes

Based on the results obtained on our entire population, we show that Cap_{thick} amplitudes are with minimal and maximal relative errors close to -0.8% for plaque #M2 (corresponding to a computed Cap_{thick} of 360μ m for a theoretical value equal to 363μ m, see Fig. 1 and Table 2) and $+64.6\%$ for plaque #5 (corresponding to a computed Cap_{thick} of 68μ m instead of 41μ m, see Fig. 5d and Table 2), respectively. Figure 1 illustrates the performance of E-iMOD algorithm to detect vulnerable lesions with Cap_{thick} values ranging from 100μ m to 363μ m, respectively.

Influence of noise on plaque elasticity reconstruction

The vulnerable atherosclerotic plaque #2 with a Cap_{thick} and necrotic core area ($Area_{core}$) equal to 93μ m and 1.36 mm^2 , respectively, was used to study the influence of noise on Young's modulus and plaque morphology reconstructions (Figs. 7 and 8). Table 3 provides the correspondence between the imposed white noise (controlled by the parameter β , $1 \leq \beta \leq 6$) and the signal-to-noise ratio (SNR, in dB). Figure 7 presents the sensitivity of the E-iMOD algorithm when increasing the white noise level. The performed simulations showed that the E-iMOD method was able to highlight the VP morphology when introducing significant white noise on both radial strain and displacement fields was introduced ($\beta = 6$, Fig. 7). The Cap_{thick} and $Area_{core}$ amplitudes were under-estimated and vary from $87.19 \pm 7.51 \mu$ m and $1.32 \pm 0.03 \text{ mm}^2$ with a white noise of $\beta = 1$ to $82.75 \pm 5.63 \mu$ m and $1.18 \pm 0.28 \text{ mm}^2$ with triple

white noise ($\beta = 6$), respectively (Fig. 8a, d). The E-iMOD method reasonably identified mean Young's moduli of the necrotic core and fibrous region with both maximal relative error lower than 20% (Fig. 8b, c).

DISCUSSION

The SNR acquired with the HD-IVUS systems may allow a better estimation of the intraplaque radial strain distribution in the endoluminal plaque region than in the adventitial region (*i.e.*, deeper tissue; Kobayashi *et al.* 2014; Waters *et al.* 2011). Therefore, in the current study, the native iMOD approach was successfully revisited and extended to permit the elasticity reconstruction of the endoluminal atherosclerotic region only, based on the reliability of the strain field measured in such zone.

Is the elasticity-palpogram sufficient to predict the degree of instability of a VP?

Knowing that one of the critical keys in detection of VPs is the quantification of their mechanical properties, Céspedes *et al.* (2000) proposed an elasticity-palpography (E-P) approach. This technique estimates the apparent stiffness of the endoluminal plaque region. Although the wall stiffness quantification was computationally very fast, it suffers from major limitations because it was developed for homogeneous, isotropic, circular and concentric VPs. Therefore, Deleaval *et al.* (2013) revisited and extended the theoretical framework of the E-P approach by considering the anatomical shape of the atherosclerotic lesion. They demonstrated that the

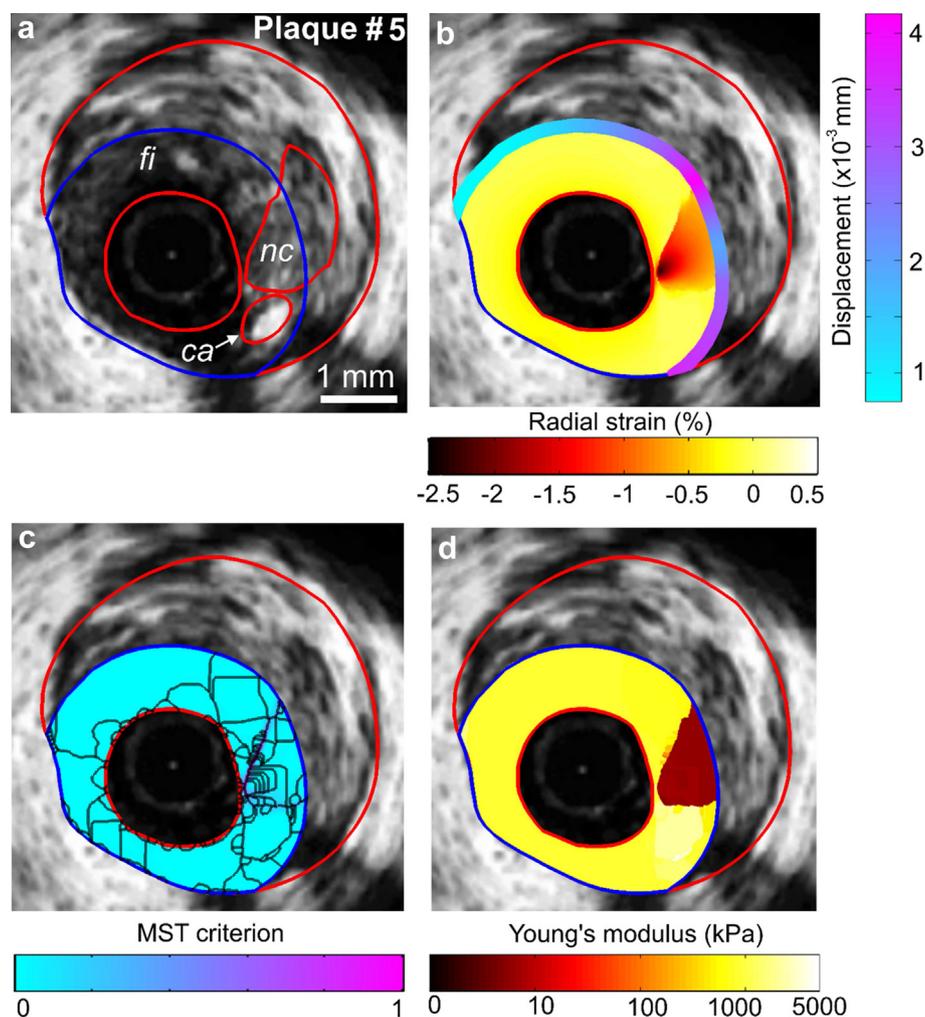


Fig. 5. Performance of the proposed E-iMOD technique to detect a vulnerable plaque with a small, calcified inclusion adjacent to a necrotic core. (a) Intravascular ultrasound image of plaque #5 with plaque constituents (red contours). (b) Radial strain-elongation and displacement applied on the intraplaque outer endoluminal boundary. (c) Spatial distribution of the normalized modified Sumi's transform criterion and extracted inclusions contours ($n = 150$). (d) Computed modulumogram. nc = necrotic core; fi = fibrous region; ca = calcified inclusion.

revisited E-P (RE-P) technique was sufficient to detect and identify plaques #2, 3, 5 and 6 considered in the present study (see palpograms presented on Figs. 2, 3, 5 and 6 of Deleaval et al. 2013). However, The RE-P technique does not permit direct measurements of the key geometrical VP determinants as the fibrous cap thickness, plaque morphology, and therefore cannot quantify the PCS.

Is the proposed E-iMOD algorithm adapted to detect and diagnose the degree of instability of a VP?

From the current clinical data, the E-iMOD algorithm is able to detect small Cap_{thick} amplitudes, necrotic core morphology and mechanical properties in the endoluminal region. The geometrical plaque features are known to be the major clinical criteria used by interventional cardiologists for predicting plaque vulnerability.

For a VP with a potential high degree of vulnerability (plaque #6, which had a Cap_{thick} of $62 \mu\text{m}$), the proposed algorithm is able to detect the Cap_{thick} (estimated $Cap_{thick} = 32 \mu\text{m}$, see Fig. 6 and Table 2). This performance was linked with the radial resolution of $15.4 \mu\text{m}$ used in our polar mesh grid, which was adapted to the resolution of the Lagrangian Speckle Model Estimator method developed by Maurice et al. (2007). However, the lower Cap_{thick} that can be detected with the IVUS system will be within the limit of the expected resolution obtained with the IVUS catheter (*i.e.*, close to $120 \mu\text{m}$ for a 20-MHz catheter, $90 \mu\text{m}$ for a 40-MHz and $40 \mu\text{m}$ for HD-IVUS >60 MHz; Righetti et al. 2002). Moreover, note that quantifying PCS amplitude *in vivo* (and then diagnosing the degree of instability of a VP) could be now performed as the E-iMOD method allows us to

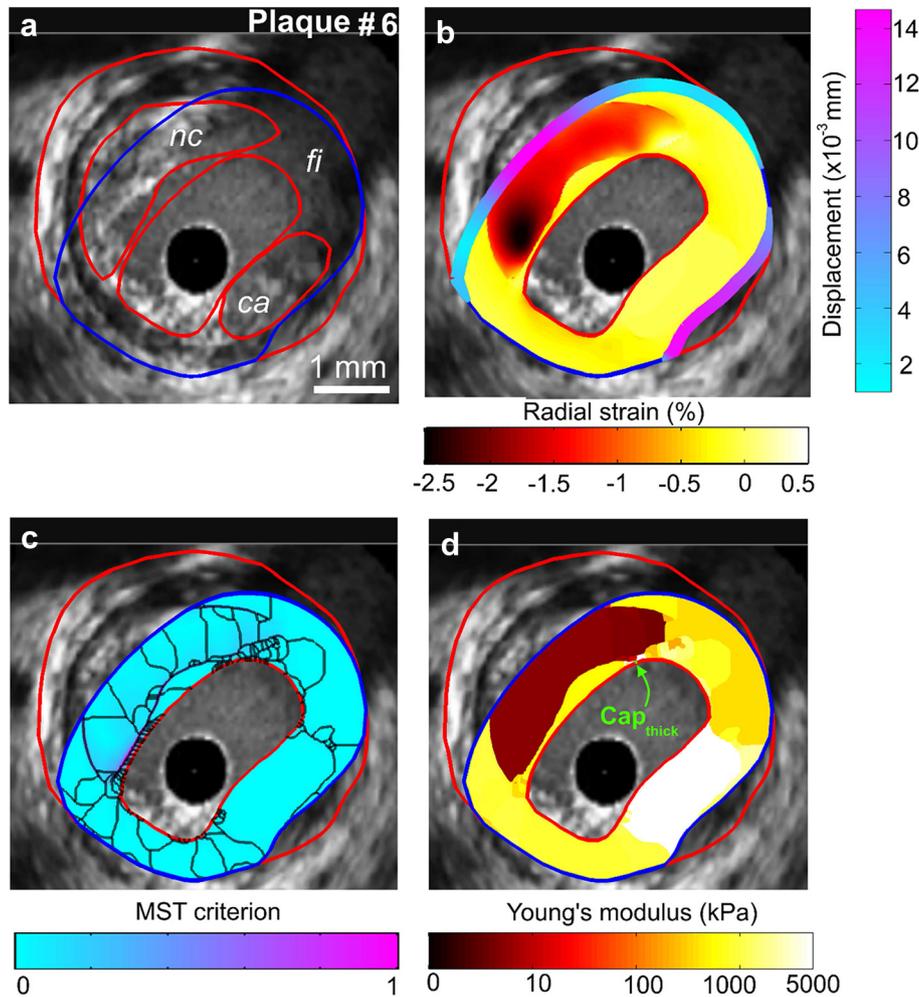


Fig. 6. Performance of the proposed E-iMOD technique to detect a vulnerable plaque with a large calcified inclusion. (a) Intravascular ultrasound image of plaque #6 with plaque contours. (b) Radial strain- elastogram and displacement applied on the intraplaque outer endoluminal boundary. (c) Spatial distribution of the normalized modified Sumi's transform criterion and extracted inclusions contours ($n = 150$). (d) Computed modulogram. nc = necrotic core; fi = fibrous region; ca = calcified inclusion.

extract both the atherosclerotic plaque morphology and the mechanical properties of all plaque components.

Is the proposed E-iMOD algorithm adapted to detect calcified inclusions?

We also investigated the performance of our algorithm in detecting large calcified inclusions within the endoluminal region of the heterogeneous plaques (Figs. 5 and 6). Our results demonstrated that the estimated Young's moduli were significantly underestimated (up to a factor 1.50) but remained high enough as to reveal the presence of rigid inclusions (Table 2). This is mainly due to the noise that stands in calcified regions, which are sites of small strain amplitudes. Similar effects were observed by Le Floc'h *et al.* (2009) when using the elasticity technique iMOD. Notice that the detection of calcified areas located in the thin fibrous cap is of clinical

importance as Cardoso *et al.* (2014) demonstrated that calcified inclusions significantly affect the plaque's stability.

The proposed E-iMOD algorithm may be used to characterize the nonlinear mechanical properties of the atherosclerotic lesion

Most biological tissues, including the coronary artery wall, have a nonlinear stress-strain behavior (Holzapfel *et al.* 2005). In the proposed E-iMOD model, the elastic behaviors of the plaque constituents were assumed to be linear. This assumption remains acceptable as strain fields measured between two successive frames of an IVUS sequence (30 frames/sec) were used (Le Floc'h *et al.* 2012). Such a technique may be used to incrementally characterize *in vivo* the nonlinear mechanical responses of atherosclerotic plaque components

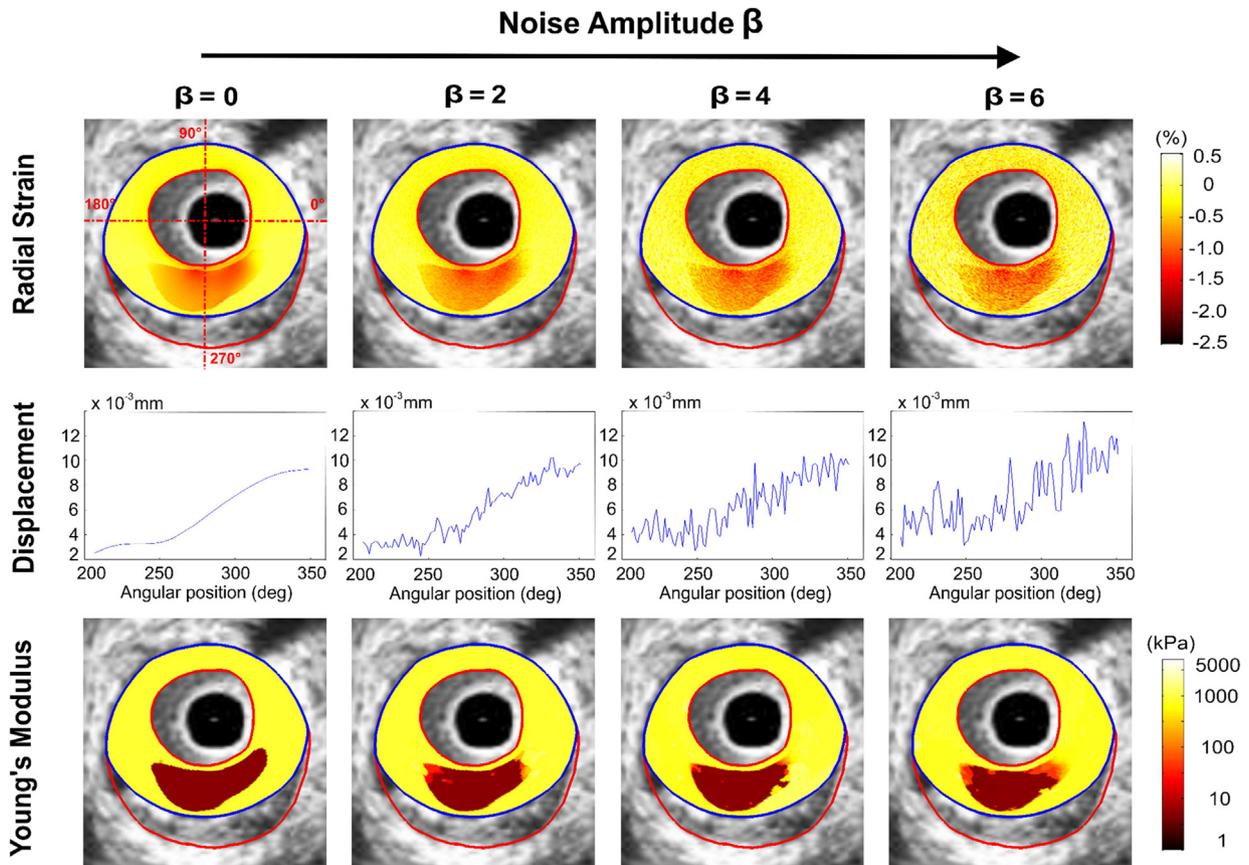


Fig. 7. Results of the sensitivity analysis performed to investigate the influence of the white noise added to the strain and displacement fields on the reconstructed modulograms. Plaque #2 was used for this study. Row 1: Input radial strain fields obtained with different levels of white noise ($\beta = 2, 4$ and 6). Row 2: Input displacement fields applied on the intraplaque outer endoluminal boundary and obtained with different levels of white noise ($\beta = 2, 4$ and 6). Row 3: Resulting plaque morphologies and modulograms. For all these simulations, the numbers of extracted inclusions contours were equal to 20.

occurring during the cardiac cycle. This has been successfully tested and validated using an *in vitro* experimental study performed by our group with the native iMOD algorithm on vessel phantoms (Le Floc'h et al. 2010).

Study limitations

Although this technique presents original and potentially promising concepts for IVUS identification and characterization of atherosclerotic lesions, several limitations deserve to be pointed out at this stage.

The first one is that the proposed IVUS-elasticity reconstruction technique E-iMOD has been tested on a limited number of *in vivo* plaque geometries ($n = 7$).

A second study limitation was that all plaque constituents, including the arterial wall, were assumed to be isotropic. The anisotropic mechanical properties of the normal artery components (*i.e.*, intima, media and adventitia) have been well described in the elegant experimental and theoretical works of Holzapfel et al. (2005) for human coronaries. However, a sensitivity study with

regard to material properties (comparing the mechanical responses of atherosclerotic lesions when the plaque constituents were assumed to be anisotropic or isotropic) has been performed by Kamm's group (Williamson et al. 2003). They found that either isotropic or anisotropic models provide similar results for the prediction of PCS location in diseased arteries with a PCS underestimation close to 30% when considering isotropic media. Moreover, this point should be seen in the light of our aim, which was to develop new IVUS-based imaging techniques that (i) automatically identify the contours of all components (including the necrotic cores and calcified inclusions) of the plaque, (ii) highlight morphology of lesions, (iii) quantify the cap thickness amplitude and (iv) permit estimation of the mean homogenized (or apparent) isotropic Young's moduli of the necrotic core and all other plaque constituents. However, more sophisticated anisotropic elasticity *in vivo* reconstruction methods deserve to be investigated in a future study to overcome such limitations.

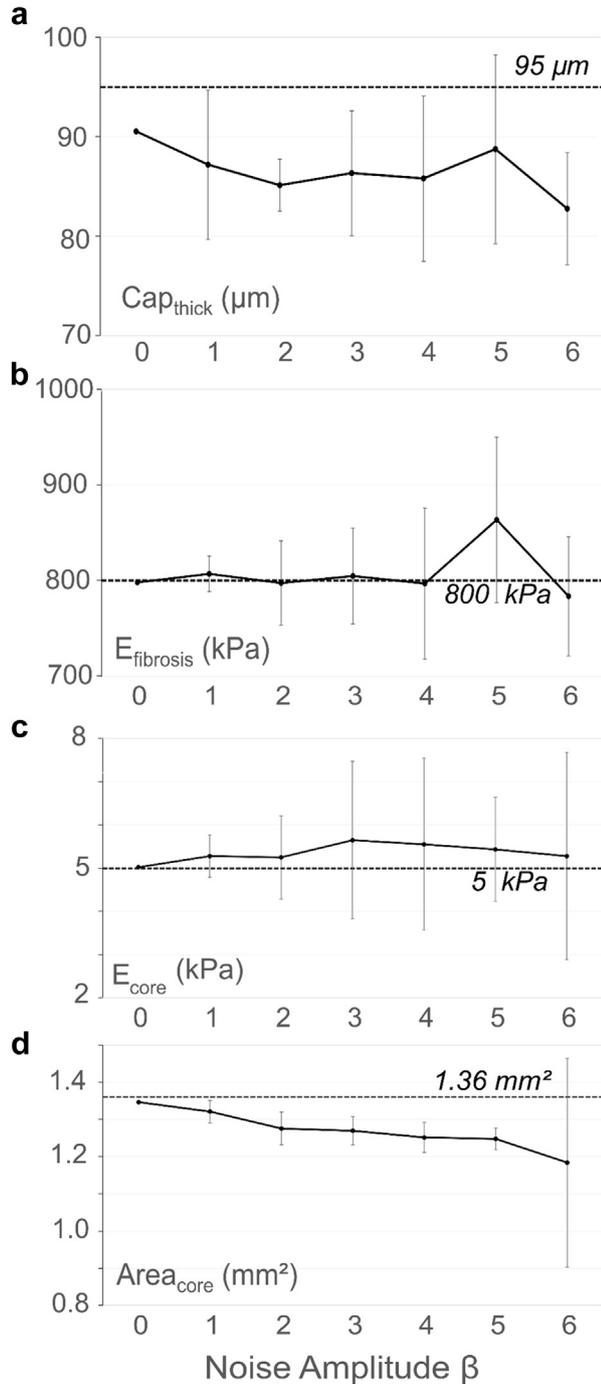


Fig. 8. Influence of white noise amplitude on estimations of cap thickness (Cap_{thick}), Young's moduli of the necrotic core (E_{core}) and fibrosis ($E_{fibrosis}$) and necrotic core area ($Area_{core}$). Plaque #2 was used for this investigation. Knowing that the noise was spatially randomly distributed, we performed 20 computations for each amplitude of noise β and present the mean values \pm the standard deviations. The *dashed lines* indicate the values used for the forward problem. (a) Influence of noise on Cap_{thick} estimation. (b) Influence of noise on $E_{fibrosis}$ estimation. (c) Influence of noise on E_{core} estimation. (d) Influence of noise on $Area_{core}$ estimation.

Table 3. Correspondence between the imposed levels of white noise (*i.e.* β) and the signal-to-noise ratio (SNR) amplitudes. For each level of noise β , 20 computations in which the noise was spatially randomly distributed were performed. Mean SNR and standard deviation values of input radial strain (ϵ_{rr}), radial displacement (u_r) and circumferential displacement (u_θ) are given. Plaque #2 was used for this investigation

β	SNR (dB)		
	ϵ_{rr}	u_r	u_θ
1	18.74 \pm 0.06	20.33 \pm 0.04	16.57 \pm 0.04
2	12.97 \pm 0.05	14.31 \pm 0.05	10.53 \pm 0.04
3	9.45 \pm 0.06	10.79 \pm 0.04	7.00 \pm 0.05
4	6.93 \pm 0.08	8.24 \pm 0.06	4.53 \pm 0.07
5	4.98 \pm 0.05	6.36 \pm 0.03	2.56 \pm 0.03
6	3.42 \pm 0.06	4.76 \pm 0.04	0.99 \pm 0.04

A third limitation of this study was that the full 3-D structures of the atherosclerotic lesions have not been considered in this study because only 2-D IVUS sequences are acquired in routine imaging during the clinical protocol. Therefore, the FE simulations were conducted under plane strain assumption. This assumption is reasonable insofar as (i) plaque length is large with regard to the radial dimension of the artery and (ii) neighboring cross-sectional morphologies remain similar (Ohayon *et al.* 2005).

Potential clinical implications

Our group (Finet *et al.* 2004) demonstrated that a very slight change in the Young's moduli of plaque constituents, namely the hardening of the soft necrotic core, can shift a VP from instability to stability. This finding is in agreement with several other studies conducted to analyze the effects of statins and angiotensin-converting enzyme inhibitors on structural variation in the fibrous cap and necrotic core, revealing an enhancement in plaque stability (Abela *et al.* 2011; Libby *et al.* 2002; Nie *et al.* 2014; Nozue *et al.* 2012; Yla-Herttuala *et al.* 2011). Due to its performance and accuracy, the proposed E-iMOD elasticity imaging technique could provide an original approach to analyze the evolution of the mechanical properties of atherosclerotic plaques during drug therapies.

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