

# Noninvasive Fractional Flow Reserve from Coronary CT Angiography

**Bon-Kwon Koo, MD, PhD**

Seoul National University Hospital, Seoul, Korea

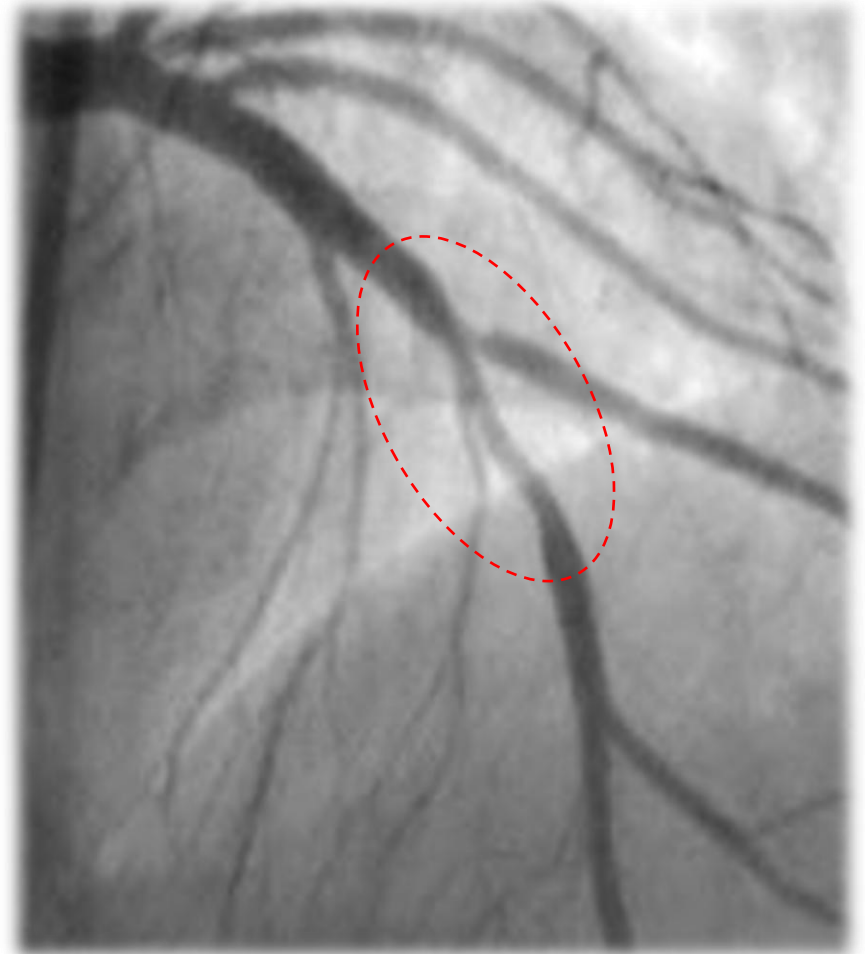
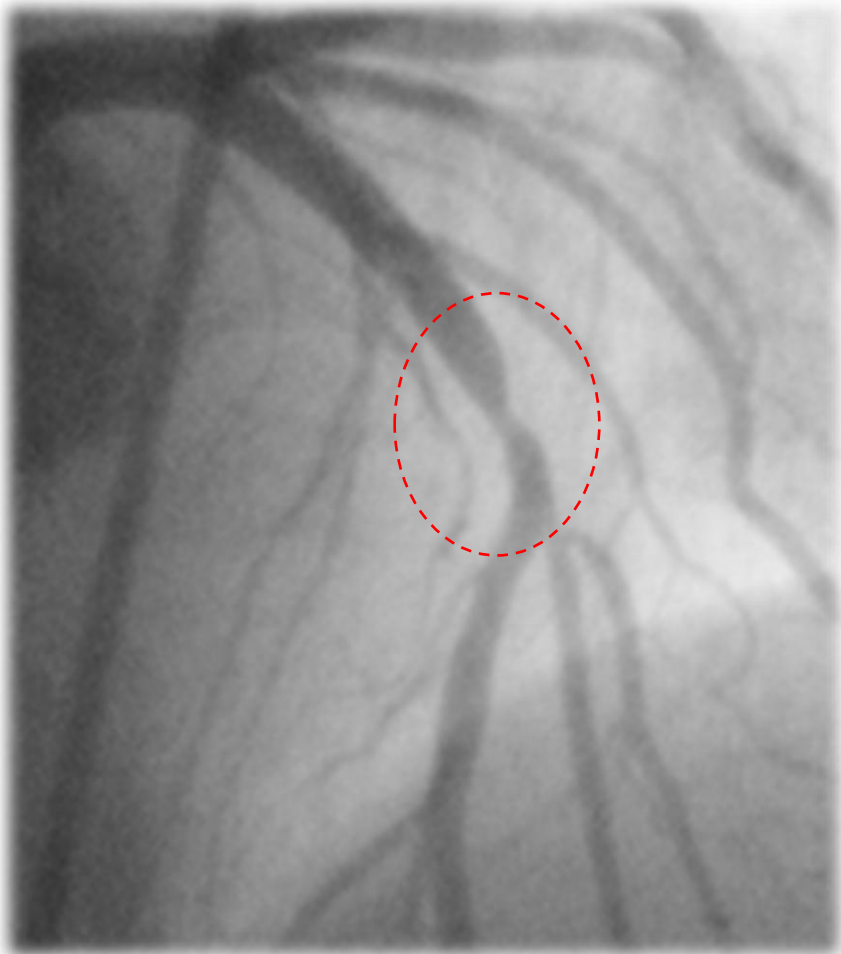


# Why the hemodynamics for coronary artery disease?



**Q: Which is a significant stenosis? Please choose one.**

Coronary angiogram: left anterior descending coronary artery



# This one should be a significant stenosis!

Angiography: **significant**

CT angiography: **significant**

Intravascular ultrasound: **significant**

Simple and straightforward,  
No room for hemodynamics!

Lumen area: 2.8mm<sup>2</sup>  
Vessel area: 9.0mm<sup>2</sup>  
Plaque burden: 69%



Significant stenosis → Ischemia/Chest pain → Stent or surgery → Better prognosis



# Which is a significant stenosis?

*: Anatomy vs. Ischemia*



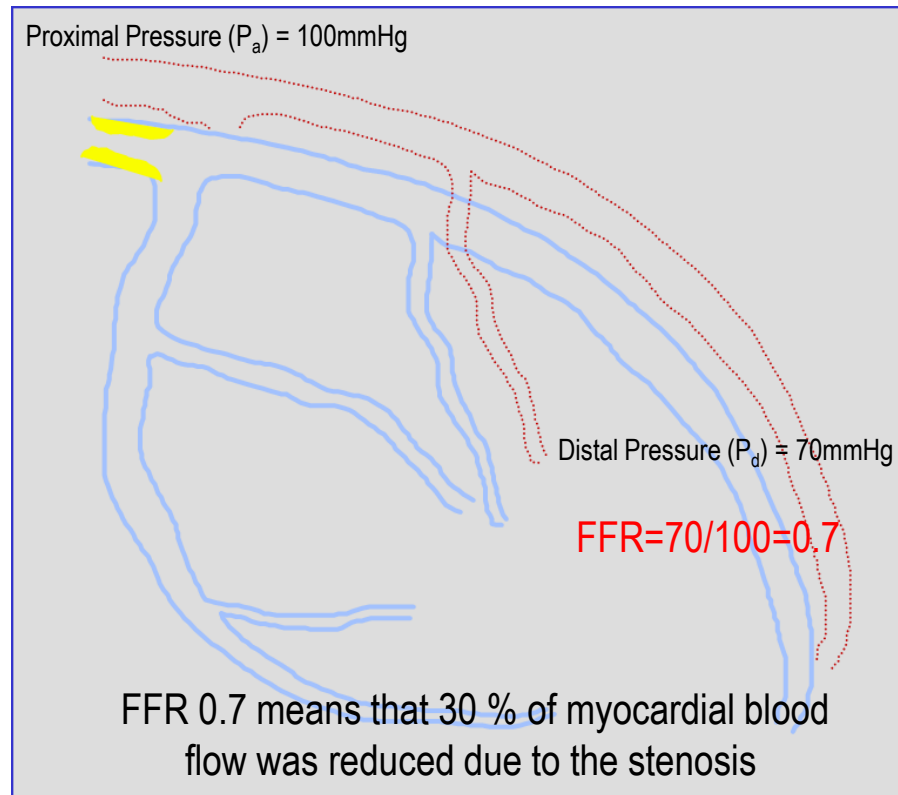
- Stenosis severity by CT, angiography, intravascular US, .....
- Extent of the perfusion territory
- Presence of myocardial infarction
- Myocardial blood flow including collaterals
- Microvascular function

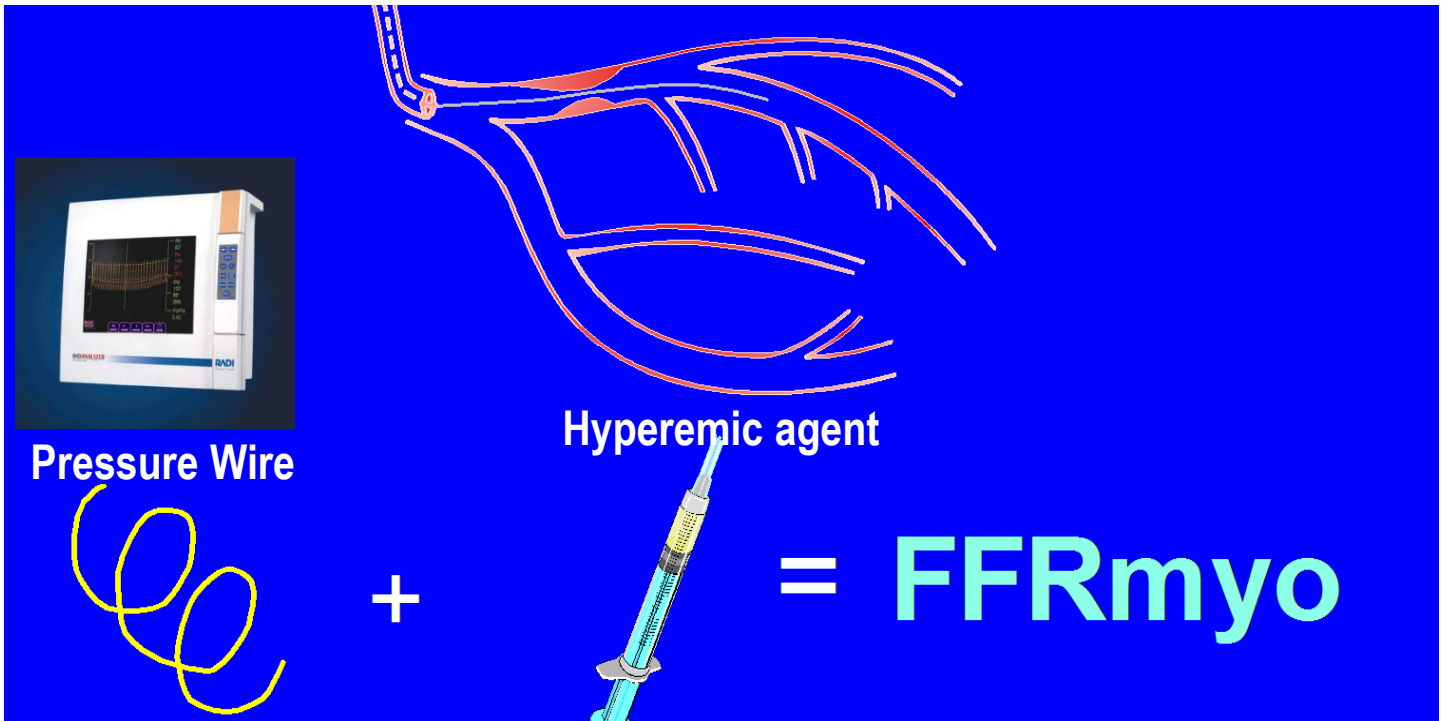
→ ***Physiologic or functional evaluation***

# “Fractional Flow Reserve (FFR)”

- Invasive physiologic test in a cath lab with very high spatial resolution

$$\text{FFR} = \frac{\text{Maximum flow in presence of stenosis}}{\text{Normal maximum flow}} = \frac{Q_{max}^S}{Q_{max}^N} = \frac{(P_d - P_v)/R}{(P_a - P_v)/R} = \frac{\text{Distal Pr } (P_d)}{\text{Proximal Pr } (P_a)}$$





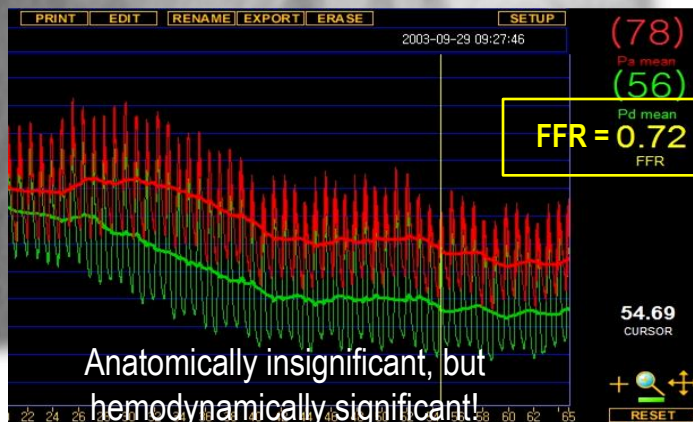
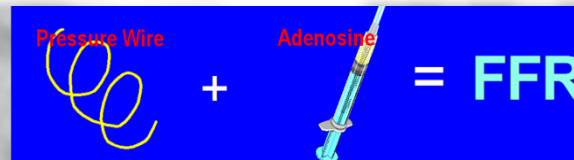
## FFR vs. Myocardial ischemia



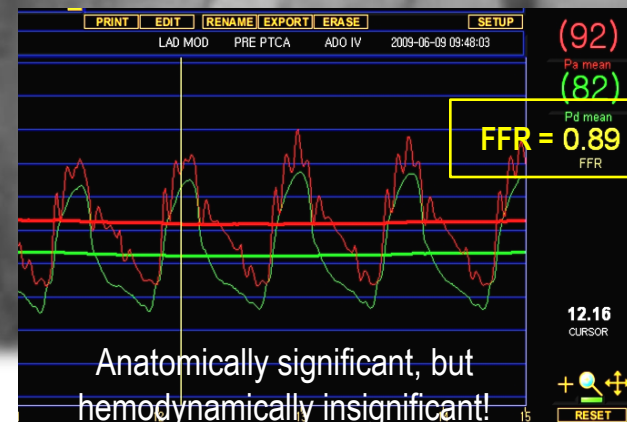


# Q: Which is a significant stenosis? Please choose one.

Coronary angiogram: left anterior descending coronary artery



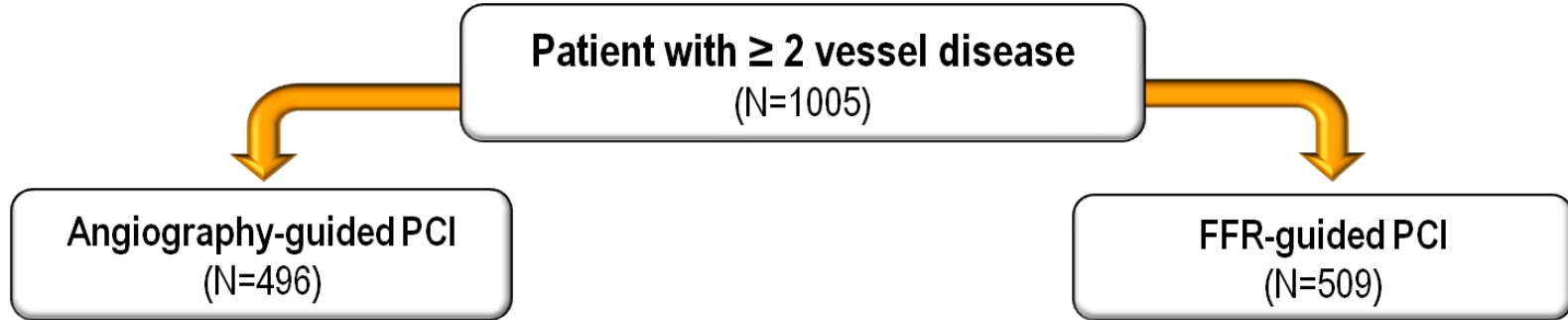
Anatomically insignificant, but hemodynamically significant!



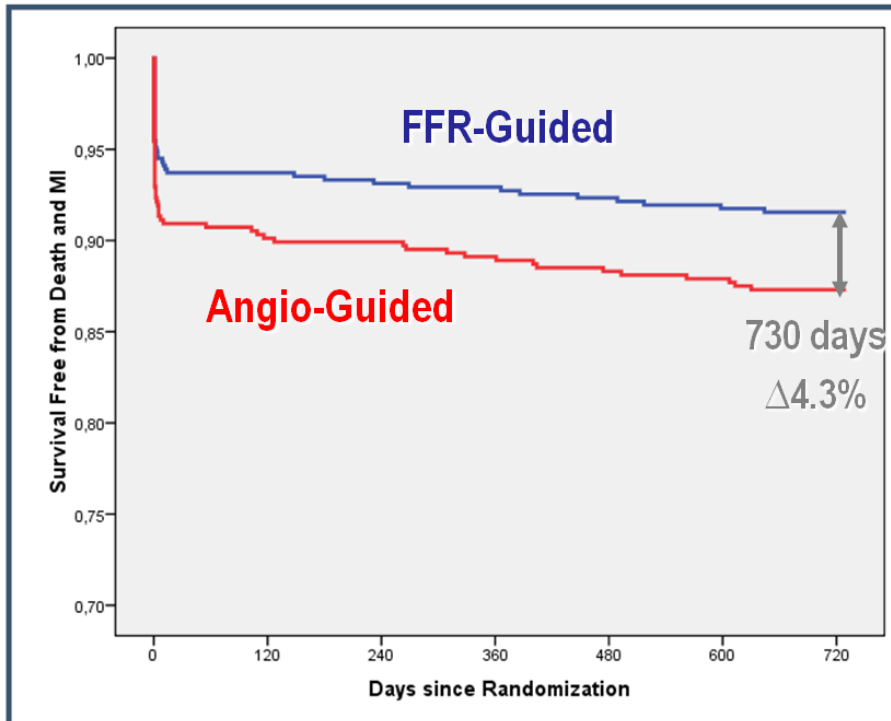
Anatomically significant, but hemodynamically insignificant!



# FAME study



2 Year Death/Myocardial infarction-free survival



## FFR (hemodynamics)-guided vs. Anatomy-guided

- Less stent
- Less cost
- Same procedural time
- Better clinical outcomes

# FFR is good for the patients and (relatively) simple.....



European Heart Journal (2010) 31, 2501–2555  
doi:10.1093/eurheartj/ehq277

ESC/EACTS GUIDELINES



## Guidelines on myocardial revascularization

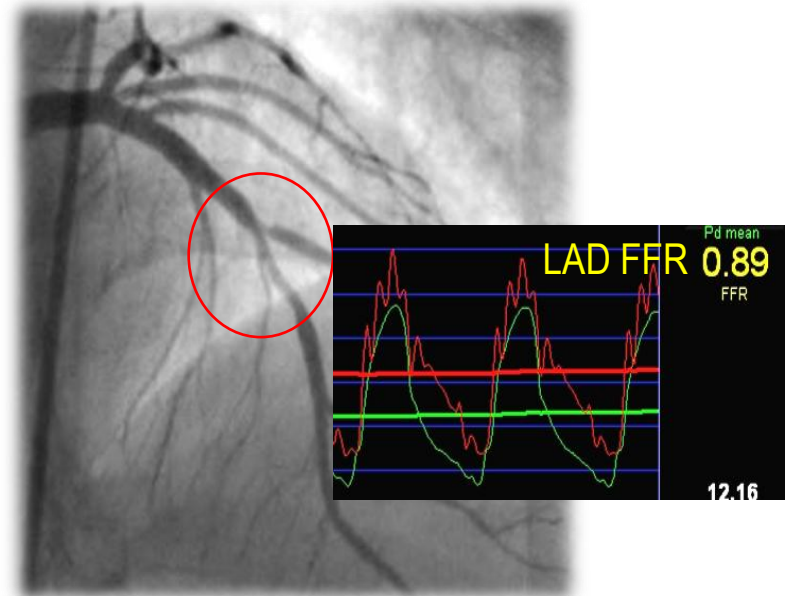
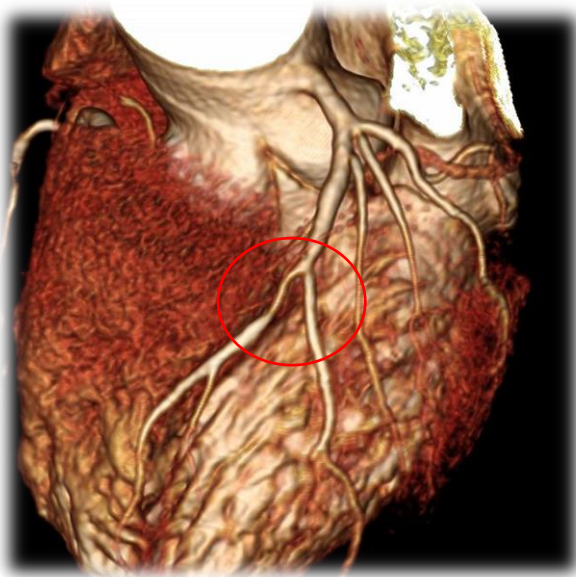
The Task Force on Myocardial Revascularization of the European Society of Cardiology (ESC) and the European Association for Cardio-Thoracic Surgery (EACTS)

FFR-guided PCI is recommended for detection of ischaemia-related lesion(s) when objective evidence of vessel-related ischaemia is not available.

Class <sup>a</sup>	Level <sup>b</sup>
I	A
I	A

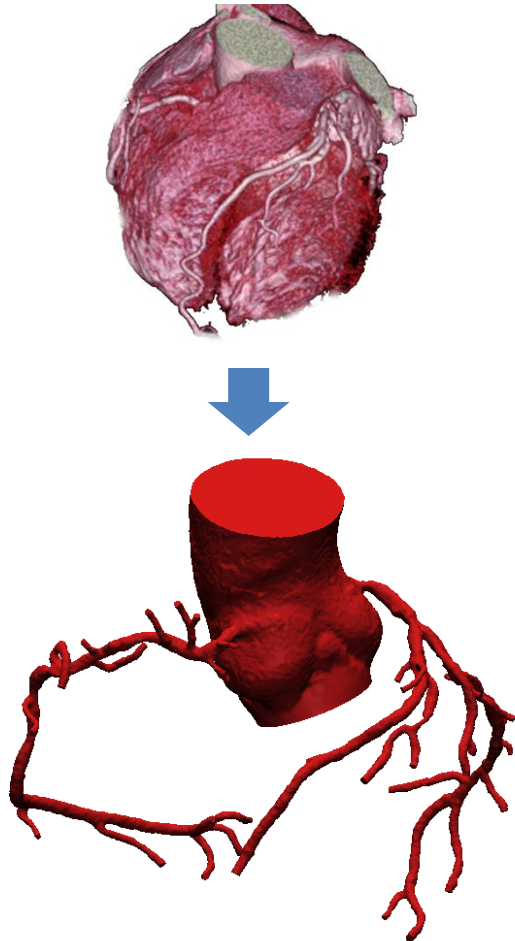
DES<sup>d</sup> are recommended for reduction of restenosis/occlusion, if no contraindication to extended DAPT

But, requires invasive procedure and expensive (>1,000 USD)..... cannot provide 3D anatomical information....



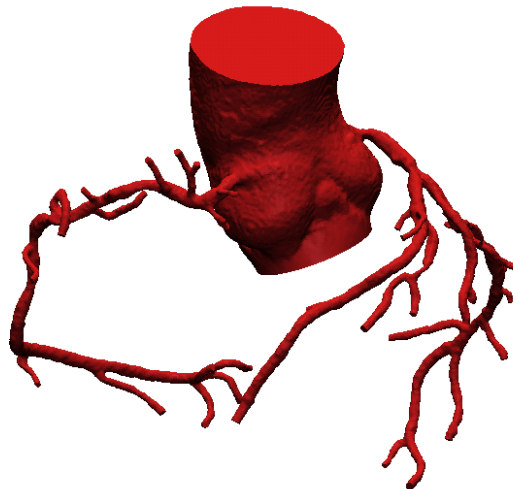
# How to assess hemodynamics from static images?

3-D Model based on CCTA

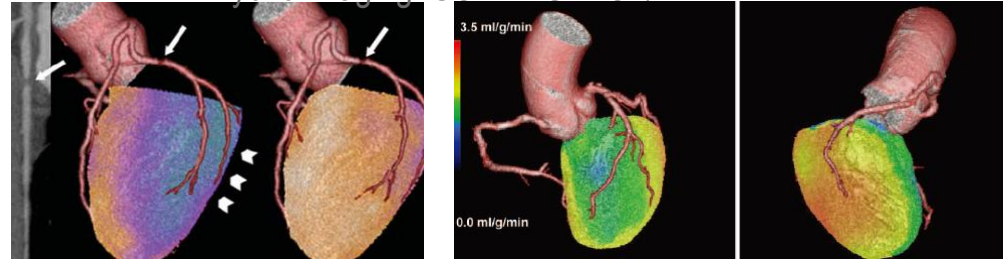


# Integration of non-invasive coronary imaging and hemodynamic lesion assessment

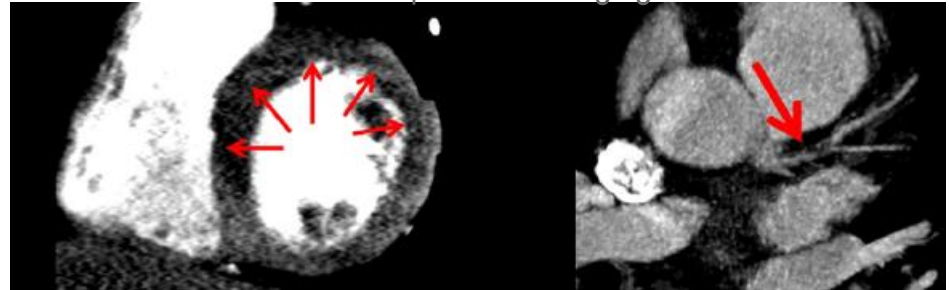
## 3-D Model based on CCTA



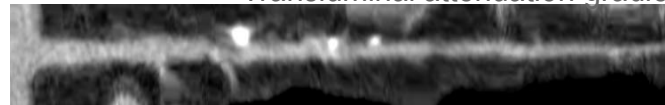
## Hybrid imaging: CCTA + SPECT/PET



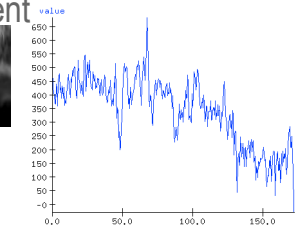
## Stress CT perfusion imaging



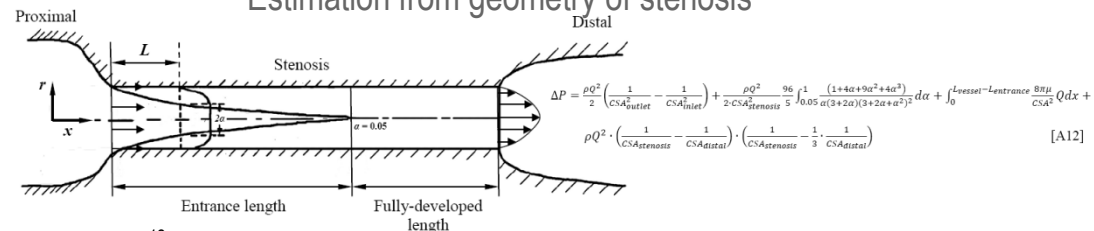
## Transluminal attenuation gradient



TAG = -15.42 (HU/10mm)

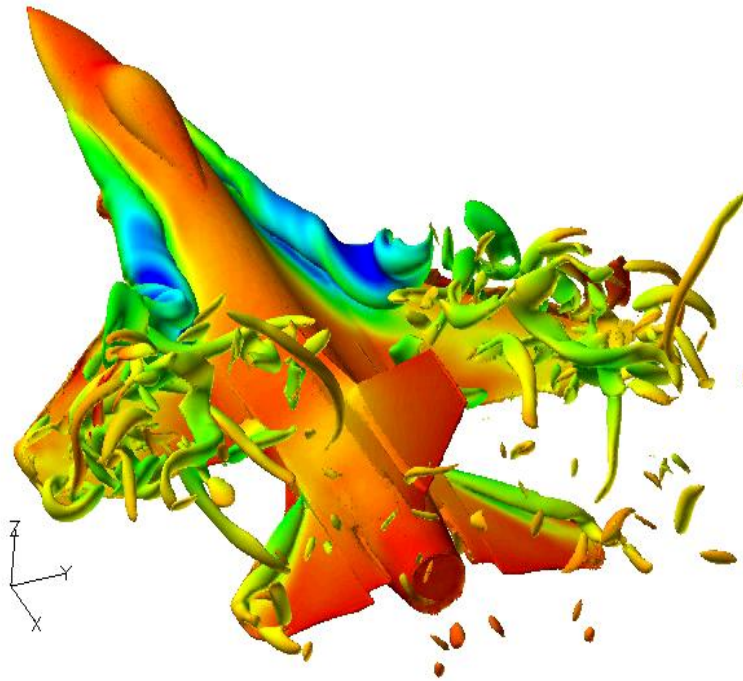


## Estimation from geometry of stenosis



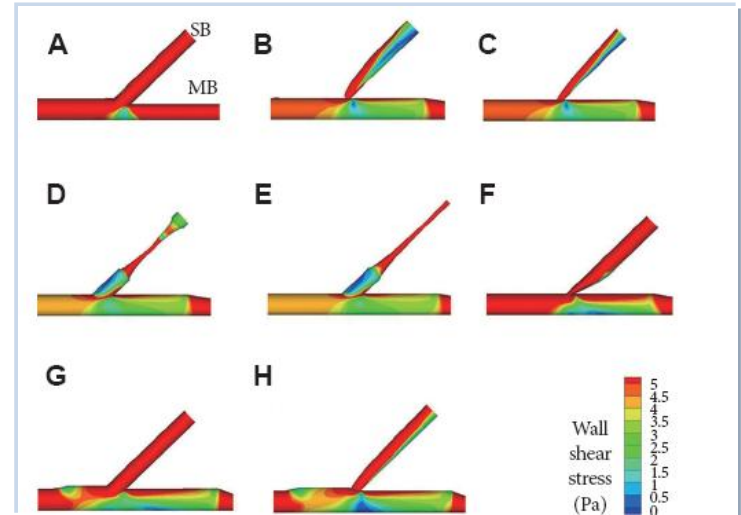
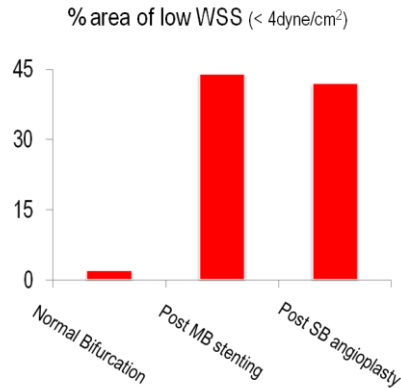
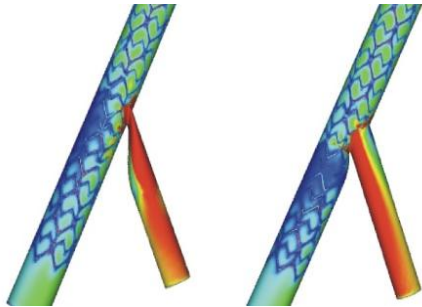
# Computational Fluid Dynamics (CFD)

- Computational fluid dynamics (CFD) quantifies fluid pressure and velocity, based on physical laws of mass conservation and momentum balance.
- CFD is widely used in the aerospace and automotive industries for design and testing.



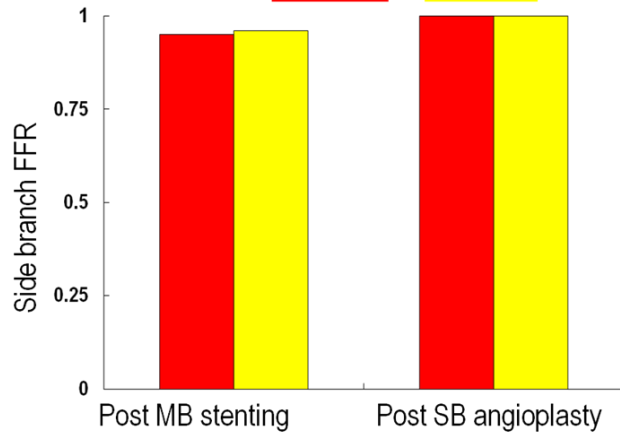


# CFD in simple and idealized coronary models

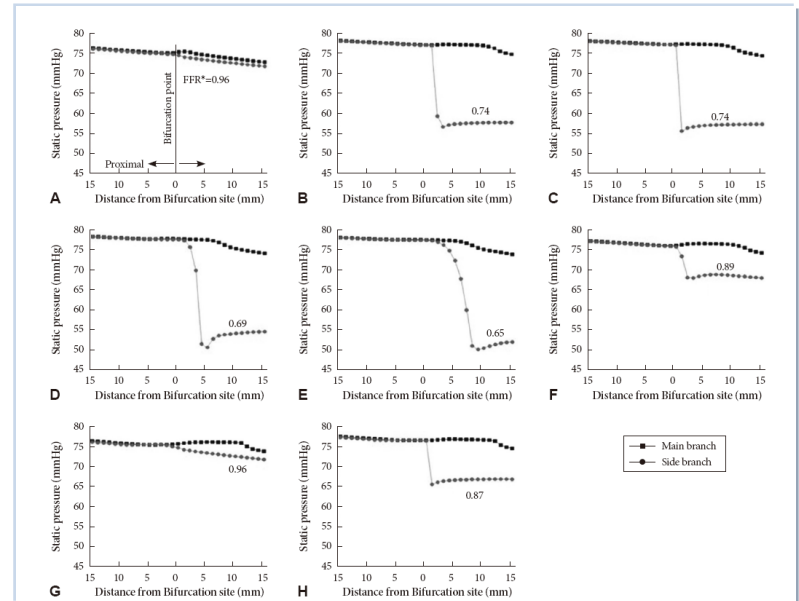


$$FFR = \frac{Q_{max}^S}{Q_{max}^N} = \frac{P_d}{P_a}$$

FLOW      PRESSURE  
 $Q_{max}^S$        $P_d$   
 $Q_{max}^N$        $P_a$



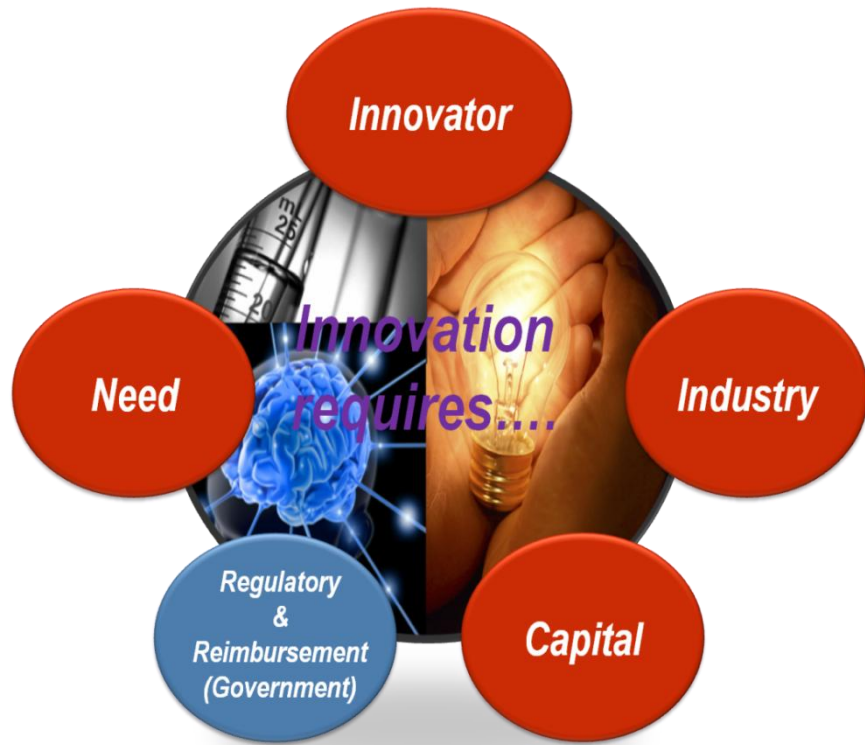
Williams & Koo, et al. J Appl Physiol 2010



Na SH, Koo BK, et al. Korean Circ J 2011



# cCTA + CFD = Pt-specific non-invasive FFR



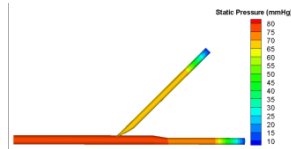
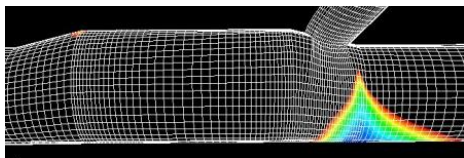
- Feb 2010: Collaboration with CV SIM

제목	Potential collaboration with Cardiovascular Simulation, Inc.
보낸 날짜	2010/02/19 금요일 오전 10:24:25
보낸 사람	"Charles Taylor" <taylor@cvsim.com> <input type="button" value="주소록에 추가"/> <input type="button" value="수신거부"/>
받는 사람	bkkoo@snu.ac.kr,
참조	"Gilwoo Choi" <giroo@cvsim.com>,
첨부	

Dear Dr. Koo,

Gilwoo Choi (my former PhD student at Stanford) provided your e-mail address to me. Gil is company, Cardiovascular Simulation, Inc. I believe that you are familiar with my company: been doing with John LaDisa. I am contacting you to inquire whether you might be interested

- 2009: Project started



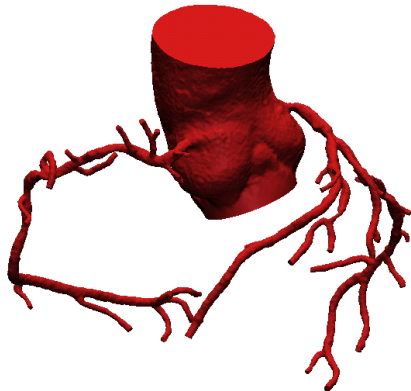
# Patient-specific non-invasive FFR using CT & CFD

## Computational Model based on CCTA

3-D anatomic model from CCTA



No additional imaging  
No additional medications



## Blood Flow Solution

Blood flow equations solved  
on supercomputer

a-k: Coronary outlets - coupled to parameter coronary vascular mod

$$\rho \bar{v}_{,t} + \rho \bar{v} \cdot \nabla \bar{v} = -\nabla p + \nabla \cdot \bar{\tau}$$

$$\nabla \cdot \bar{v} = 0$$

### Physiologic models

- Myocardial demand
- Morphometry-based boundary condition
- Effect of adenosine on microcirculation

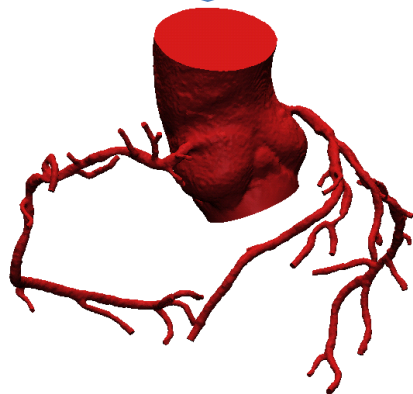
# Patient-specific non-invasive FFR using CT & CFD

## Computational Model based on CCTA

3-D anatomic model from CCTA

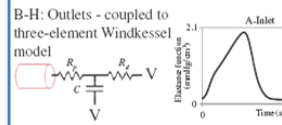
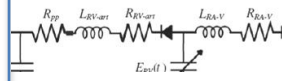
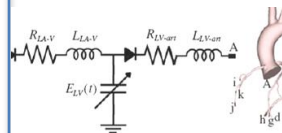


No additional imaging  
No additional medications

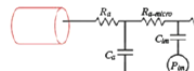


## Blood Flow Solution

Blood flow equations solved on supercomputer



a-k: Coronary outlets - coupled to parameter coronary vascular mod



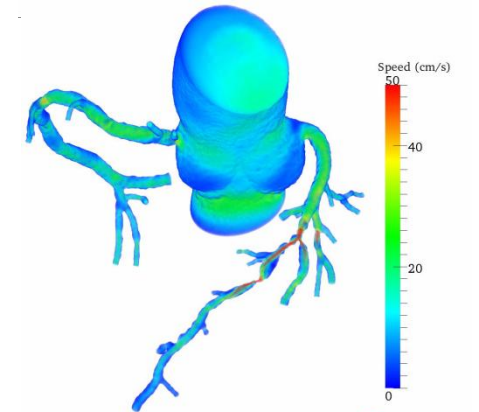
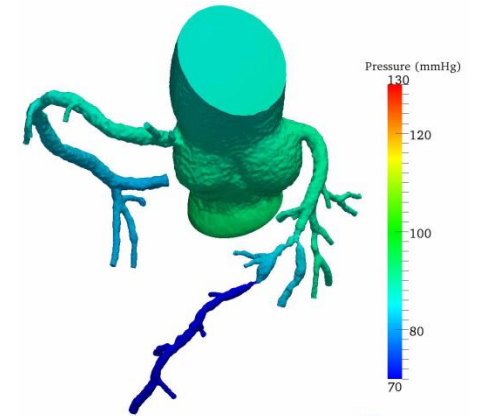
$$\rho \bar{v}_{,t} + \rho \bar{v} \cdot \nabla \bar{v} = -\nabla p + \nabla \cdot \bar{\tau}$$

$$\nabla \cdot \bar{v} = 0$$

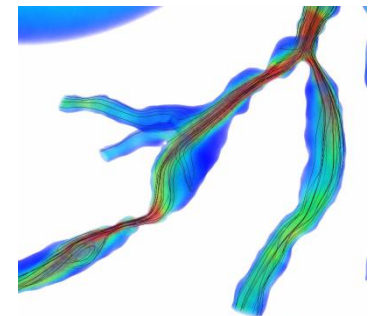


### Physiologic models

- Myocardial demand
- Morphometry-based boundary condition
- Effect of adenosine on microcirculation



HeartFlow



HeartFlow

How can this novel technology change our daily practice?

# Current pathway

CCTA



>50% diameter stenosis



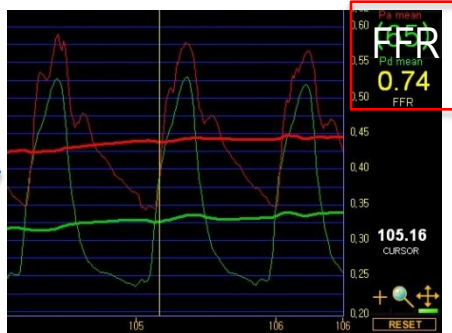
Invasive angiography



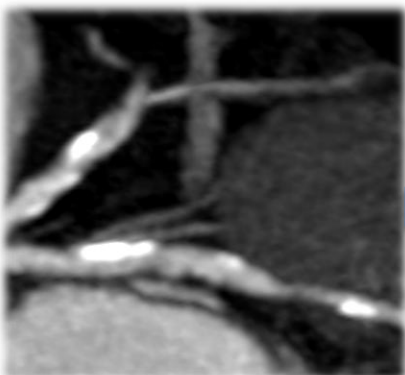
>50% diameter stenosis



FFR



FFR 0.74 → PCI



>50% diameter stenosis



>50% diameter stenosis



FFR 0.84 → Medical treatment



How this novel technology can change our daily practice?

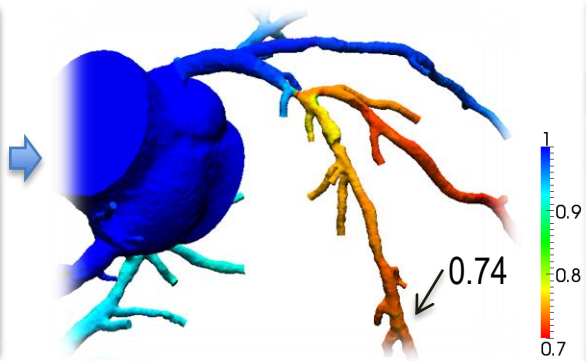
# Novel (risk-free, non-invasive, cost-saving) pathway

CCTA



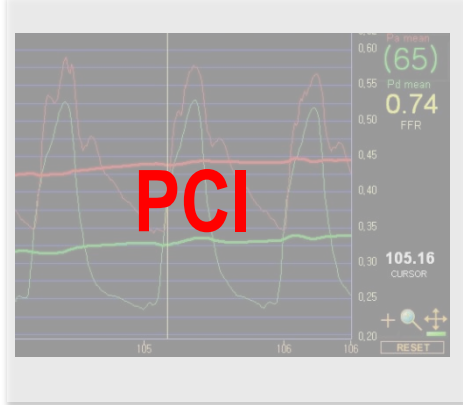
>50% diameter stenosis

FFR<sub>CT</sub>

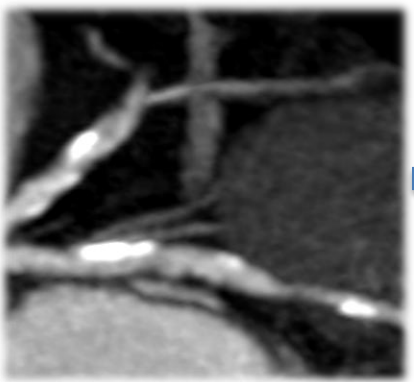


FFR<sub>CT</sub> 0.74 → Invasive procedures

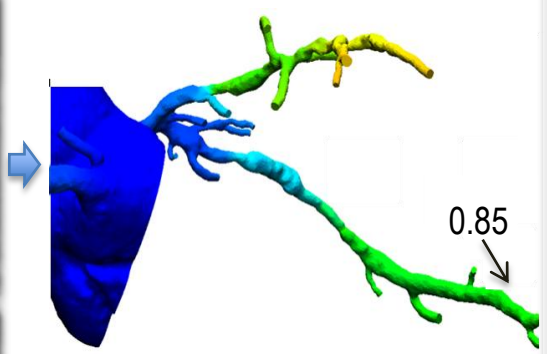
Invasive angiography and PCI



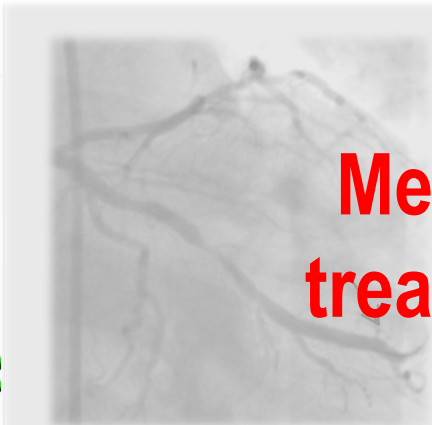
PCI



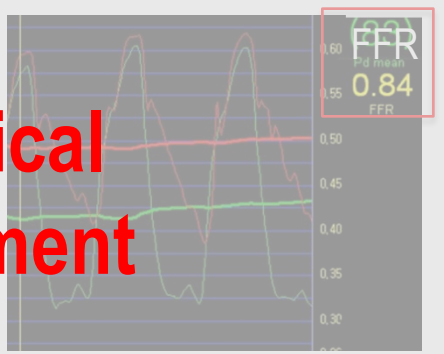
>50% diameter stenosis



0.85



>50% diameter stenosis



Medical treatment

FFR 0.84 → no ischemia

# DISCOVER-FLOW study

## First-in-Human study

- To evaluate the feasibility and diagnostic performance of FFR<sub>CT</sub>
- Prospective, multicenter study
- 159 vessels in 103 patients
- Oct 2009 – Jan 2011



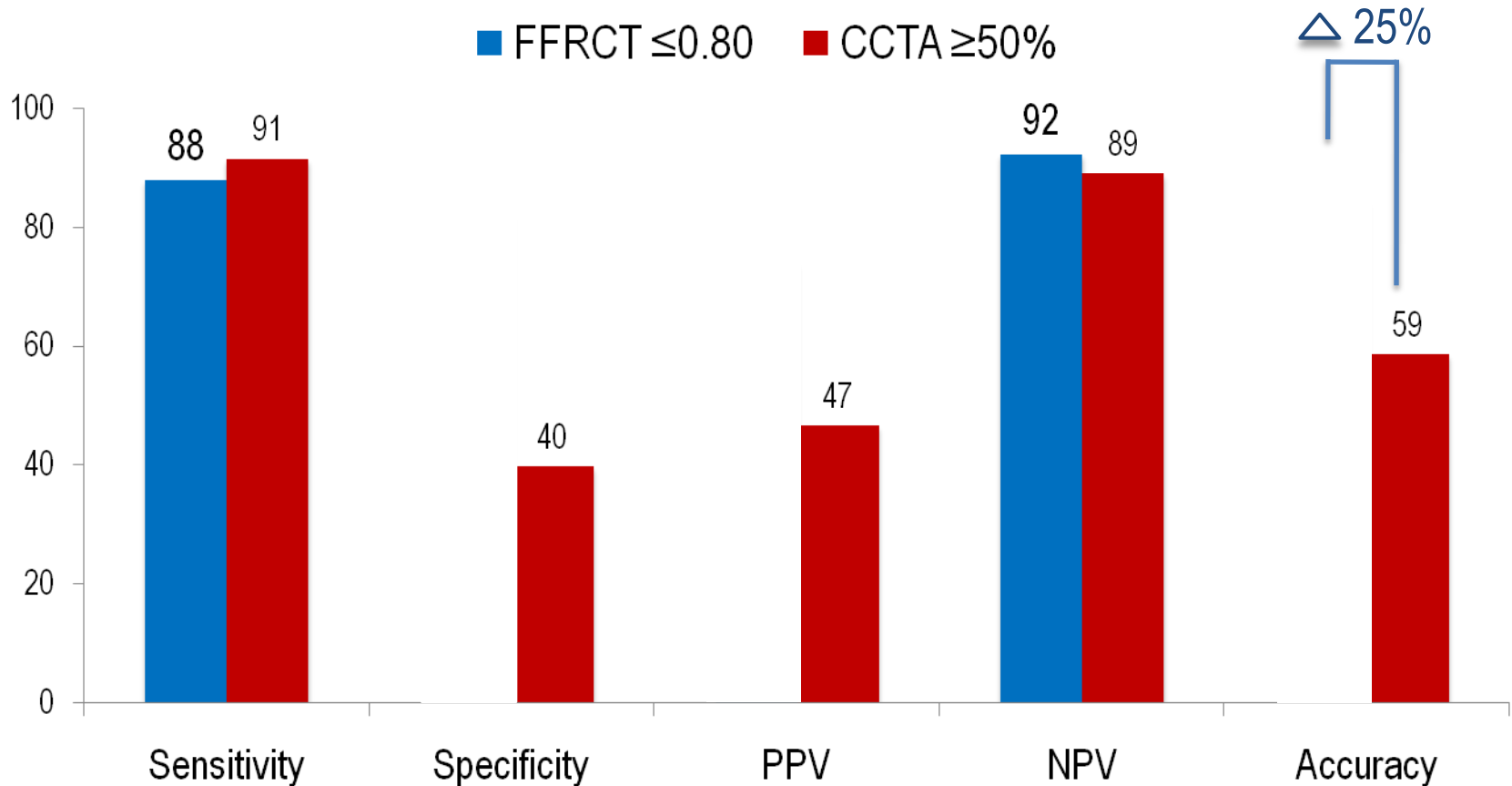
Koo BK, et al, J Am Coll Cardiol, 2011



# DISCOVER-FLOW study

## Diagnostic performance of FFR<sub>CT</sub> and CCTA

Per-vessel analysis (n=159)



PPV: positive predictive value, NPV: negative predictive value

# Clinical Evidences on Diagnostic Performance

- **DISCOVER-FLOW**  
5 center FIH clinical trial  
Completed 2011  
N=103 patients  
Published in JACC
- **DeFACTO**  
17 center clinical trial  
Completed 2012  
N=252 patients  
Published in JAMA
- **NXT**  
10 center clinical trial  
Completed August, 2013  
N=251 patients  
Published in JACC

Journal of the American College of Cardiology  
© 2011 by the American College of Cardiology Foundation  
Published by Elsevier Inc.

Vol. 58, No. 19, 2011  
ISSN 0735-1097/\$36.00  
doi:10.1016/j.jacc.2011.06.066

**Cardiac Imaging**

**Diagnosis of Ischemia-Causing Coronary Stenoses by Noninvasive Fractional Flow Reserve Computed From Coronary Computed Tomographic Angiograms**

Results From the Prospective Multicenter DISCOVER-FLOW (Diagnosis of Ischemia-Causing Stenoses Obtained Via Noninvasive Fractional Flow Reserve) Study

Bon-Kwon Koo, MD, PhD,\* Andrejs Erglis, MD, PhD,† Joon-Hyung Doh, MD, PhD,‡ David V. Daniels, MD,§ Sanda Jegere, MD,|| Hyo-Soo Kim, MD, PhD,\* Allison Dunning, MD,¶ Tony DeFrance, MD,# Alexandra Lansky, MD,\*\* Jonathan Leipsic, BSc, MD,†† James K. Min, MD‡‡  
*Seoul and Goyang, South Korea; Riga, Latvia; Palo Alto, San Francisco, and Los Angeles, California; New York, New York; New Haven, Connecticut; and Vancouver, British Columbia, Canada*

**ORIGINAL CONTRIBUTION**

**ONLINE FIRST**

**Diagnostic Accuracy of Fractional Flow Reserve From Anatomic CT Angiography**

James K. Min, MD  
Jonathon Leipsic, MD  
Michael J. Pencina, PhD  
Daniel S. Berman, MD  
Bon-Kwon Koo, MD  
Carlos van Mieghem, MD  
Andrejs Erglis, MD  
Fay Y. Lin, MD  
Allison M. Dunning, MS  
Patricia Apruzzese, MS  
Matthew J. Budoff, MD  
Jason H. Cole, MD  
Farouc A. Jaffer, MD  
Martin B. Leon, MD  
Jennifer Malpeso, MD  
G. B. John Mancini, MD  
Seung-Jung Park, MD  
Robert S. Schwartz, MD  
Leslee J. Shaw, PhD  
Laura Mauri, MD

**Context** Coronary computed tomographic (CT) angiography is a noninvasive anatomic test for diagnosis of coronary stenosis that does not determine whether a stenosis causes ischemia. In contrast, fractional flow reserve (FFR) is a physiologic measure of coronary stenosis expressing the amount of coronary flow still attainable despite the presence of a stenosis, but it requires an invasive procedure. Noninvasive FFR computed from CT (FFR<sub>CT</sub>) is a novel method for determining the physiologic significance of coronary artery disease (CAD), but its ability to identify ischemia has not been adequately examined to date.

**Objective** To assess the diagnostic performance of FFR<sub>CT</sub> plus CT for diagnosis of hemodynamically significant coronary stenosis.

**Design, Setting, and Patients** Multicenter diagnostic performance study involving 252 stable patients with suspected or known CAD from 17 centers in 5 countries who underwent CT, invasive coronary angiography (ICA), FFR, and FFR<sub>CT</sub> between October 2010 and October 2011. Computed tomography, ICA, FFR, and FFR<sub>CT</sub> were interpreted in blinded fashion by independent core laboratories. Accuracy of FFR<sub>CT</sub> plus CT for diagnosis of ischemia was compared with an invasive FFR reference standard. Ischemia was defined by an FFR or FFR<sub>CT</sub> of 0.80 or less, while anatomically obstructive CAD was defined by a stenosis of 50% or larger on CT and ICA.

**Main Outcome Measures** The primary study outcome assessed whether FFR<sub>CT</sub> plus CT could improve the per-patient diagnostic accuracy such that the lower boundary of the 1-sided 95% confidence interval of this estimate exceeded 70%.

**Results** Among study participants, 137 (54.4%) had an abnormal FFR determined by ICA. On a per-patient basis, diagnostic accuracy, sensitivity, specificity, positive predictive value, and negative predictive value of FFR<sub>CT</sub> plus CT were 73% (95% CI, 67%-78%), 90% (95% CI, 84%-95%), 54% (95% CI, 46%-83%), 67% (95% CI, 60%-74%), and 84% (95% CI, 74%-90%), respectively. Compared with obstructive CAD

# Diagnostic performance of FFR<sub>CT</sub>

	Patient No	Sensitivity	Specificity	PPV	NPV	Accuracy
<b>DISCOVER-FLOW</b>	103	93%	82%	85%	91%	87%
<b>DeFACTO</b>	252	90%	54%	67%	84%	73%
<b>NXT</b>	251	86%	79%	65%	92%	81%
	<b>Total: 606</b>	<b>90%</b>	<b>72%</b>	<b>72%</b>	<b>89%</b>	<b>80%</b>

# Non-invasive tests/FFR<sub>CT</sub>/Angiography vs. FFR



U.S. Department of Health and Human Services

**FDA** U.S. Food and Drug Administration  
Protecting and Promoting Your Health

A to Z Index | Follow FDA | En Español

Search FDA

Home | Food | Drugs | Medical Devices | Radiation-Emitting Products | Vaccines, Blood & Biologics | Animal & Veterinary | Cosmetics | Tobacco Products

News & Events

Home > News & Events > Newsroom > Press Announcements

FDA News Release

**FDA allows marketing of non-invasive device to help evaluate heart blood flow**

For Immediate Release November 26, 2014

**Release** The U.S. Food and Drug Administration today allowed marketing of the HeartFlow FFR-CT software, which permits health care professionals to non-invasively evaluate blood flow in the coronary arteries of patients showing signs and symptoms of coronary artery disease.

Inquiries: Media, Consumers

Share

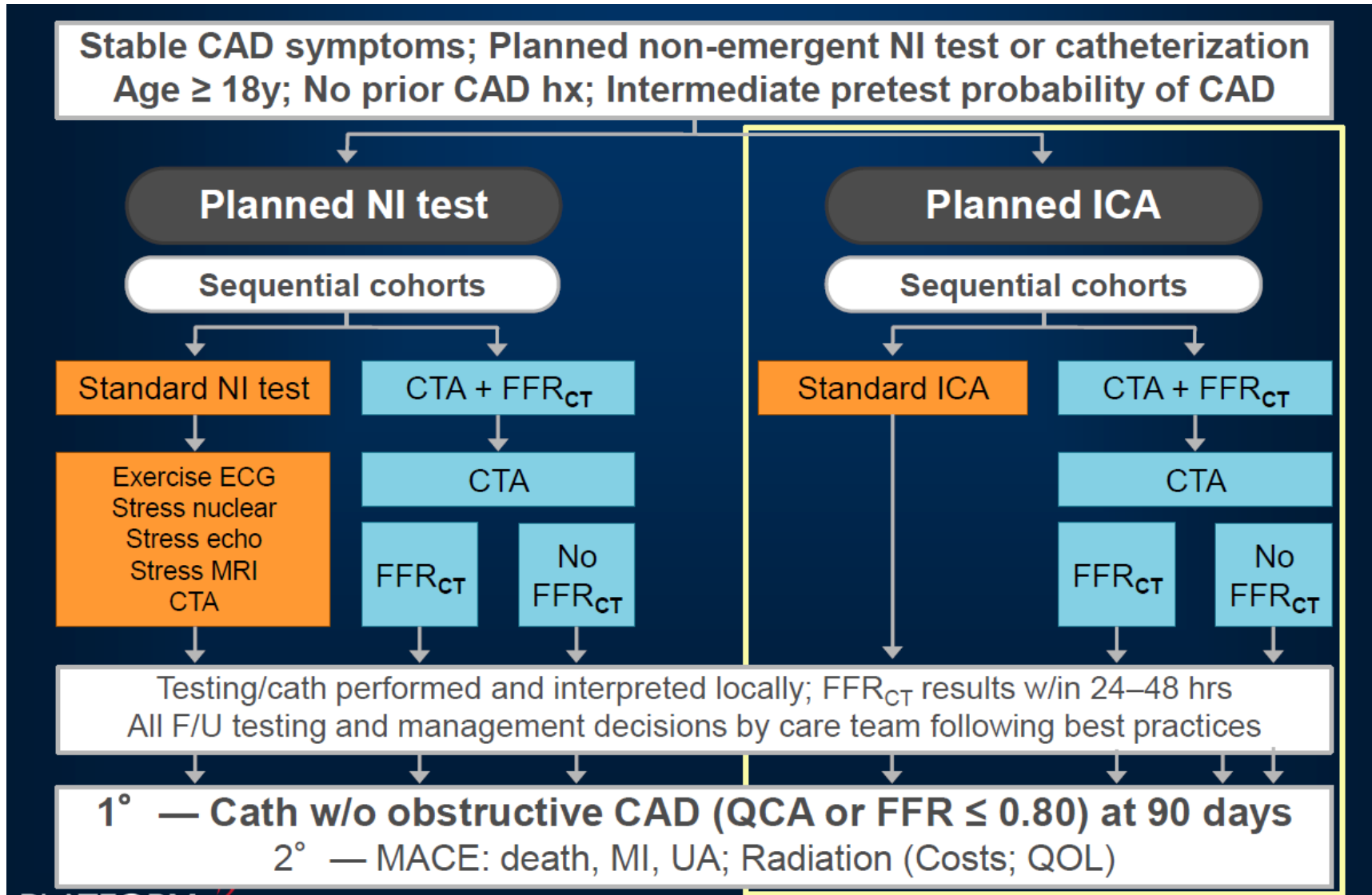
4. Min et al.

JAMA 2012;308:1237-1245

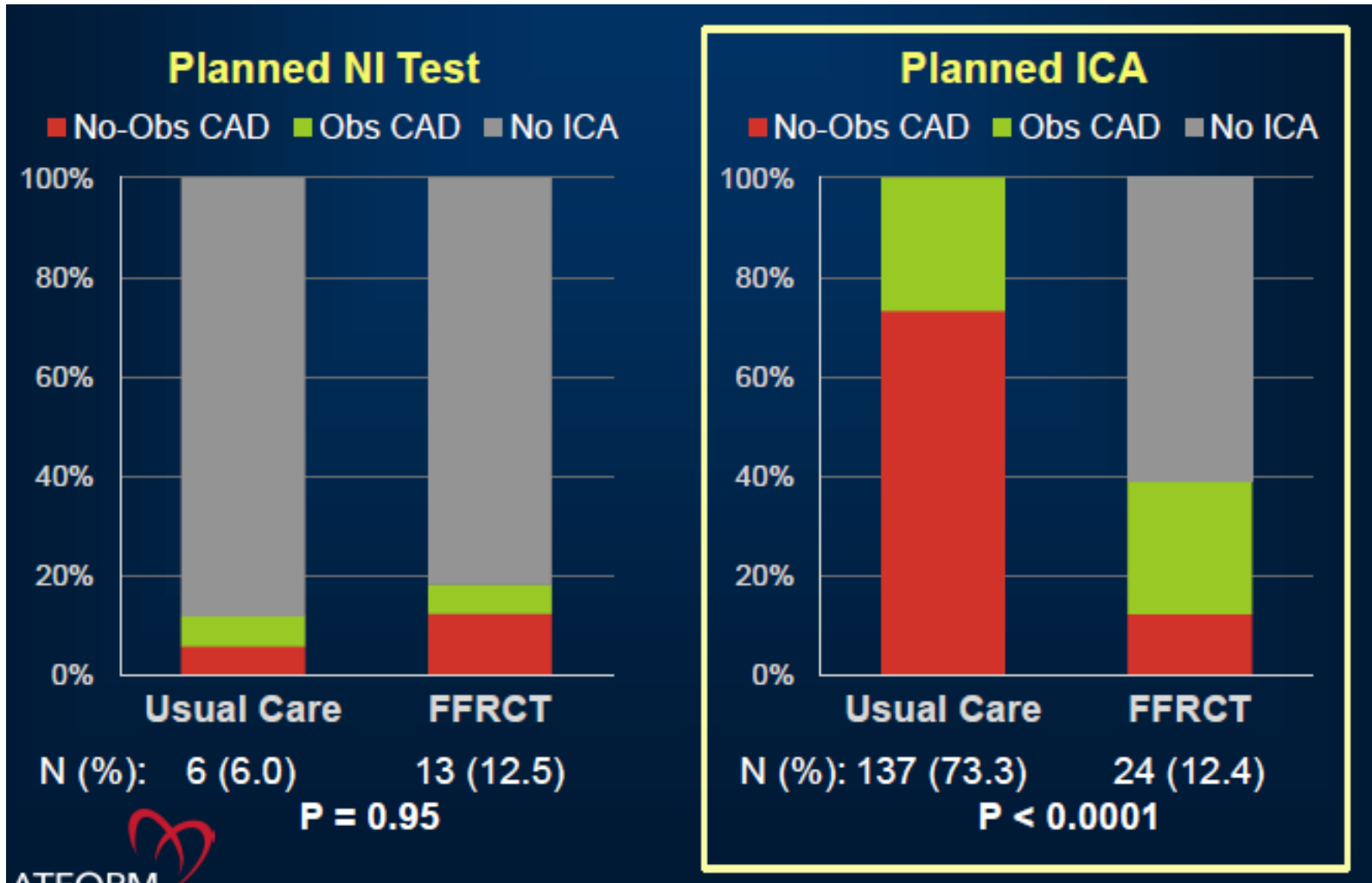
8. Norgaard et al.

JACC 2008;52:636-43  
JACC 2011;58:1989-97  
JACC 2012  
JACC 2014

# Clinical outcomes of FFR<sub>CT</sub>-guided decision



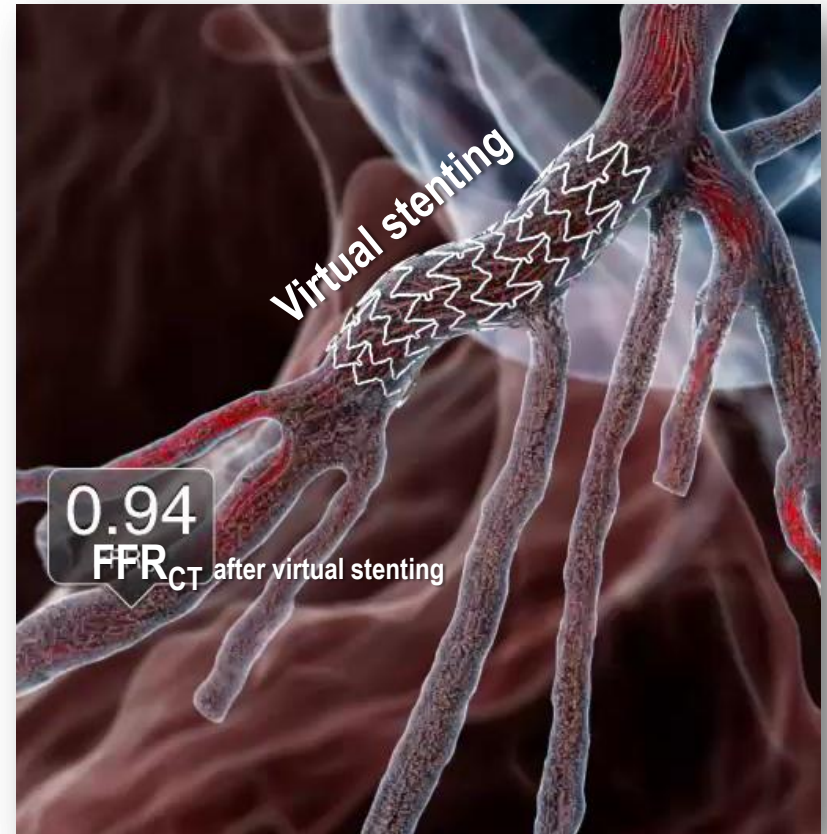
# Clinical outcomes of FFR<sub>CT</sub>-guided decision



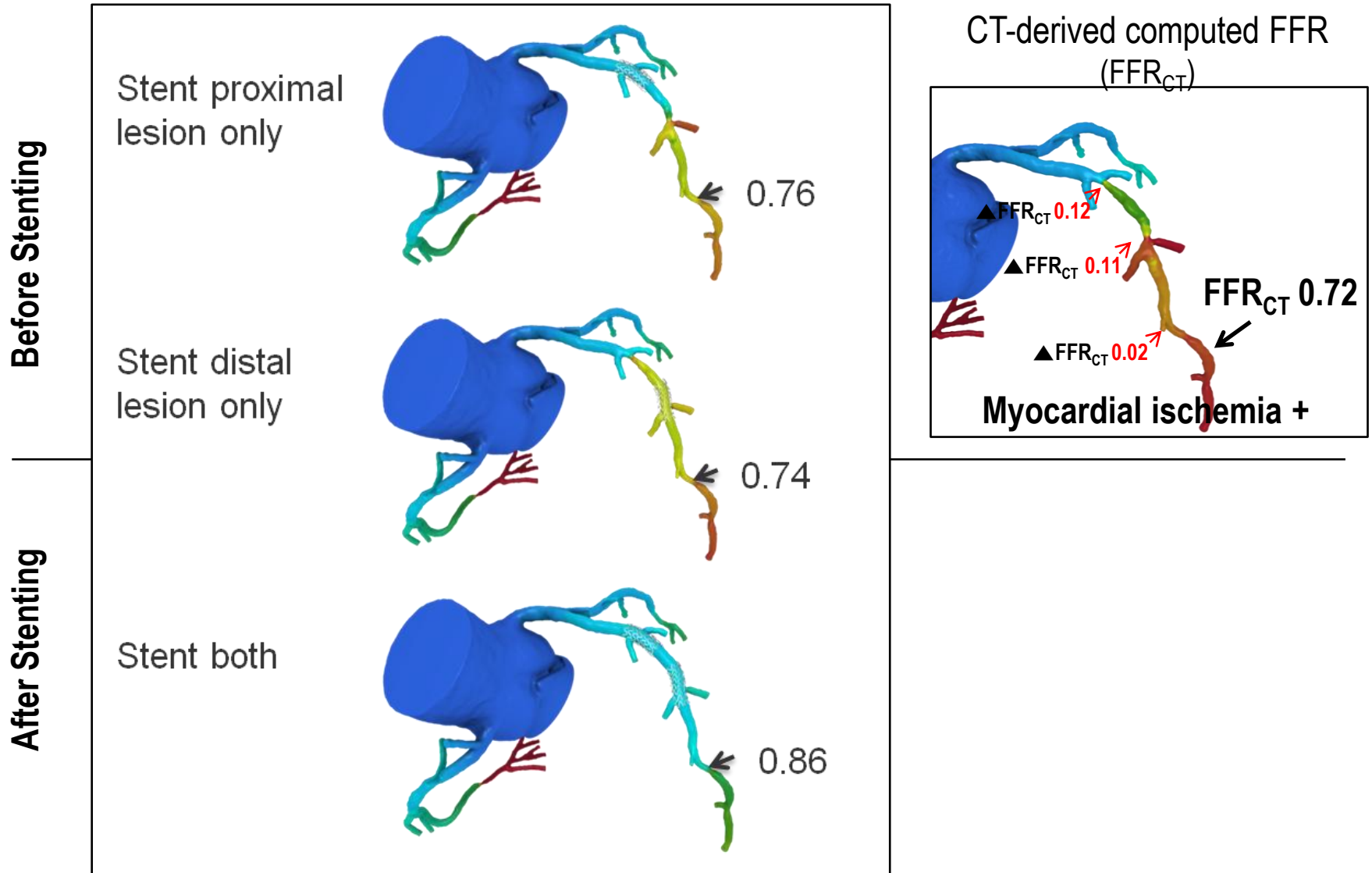


# From CTA to CT-FFR and its beyond...

Planning the treatment strategy using  
**Virtual revascularization & CT-derived computed FFR**



# Planning the treatment strategy using Virtual revascularization & CT-derived computed FFR



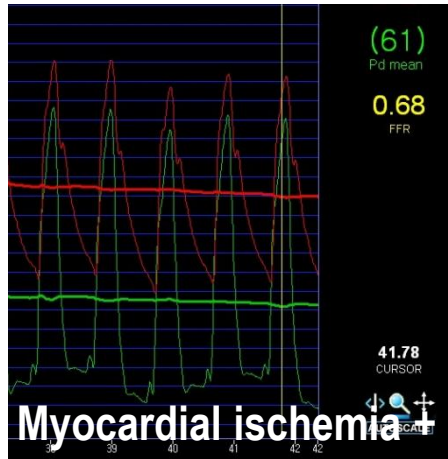
# Planning the treatment strategy using Virtual revascularization & CT-derived computed FFR

Before Stenting

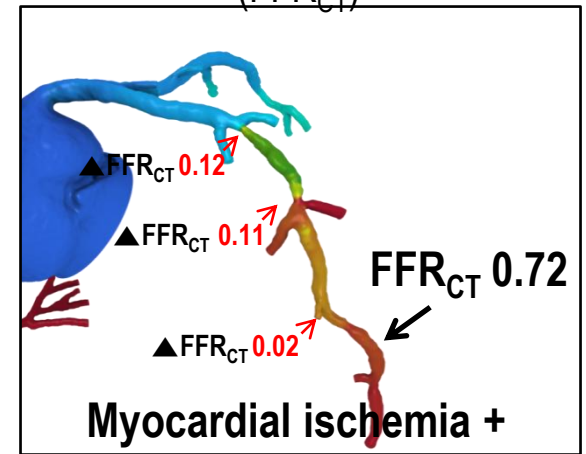
Angiography



Invasive FFR

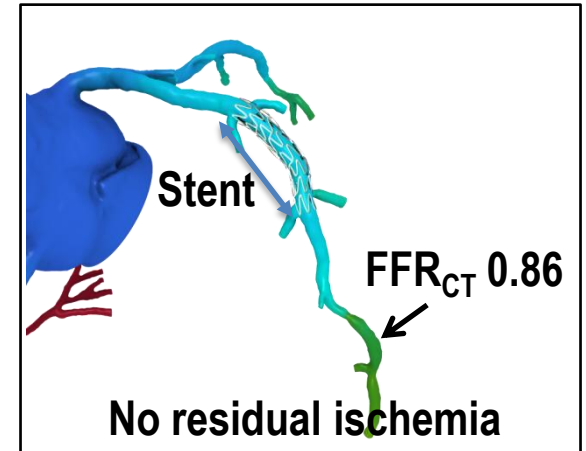
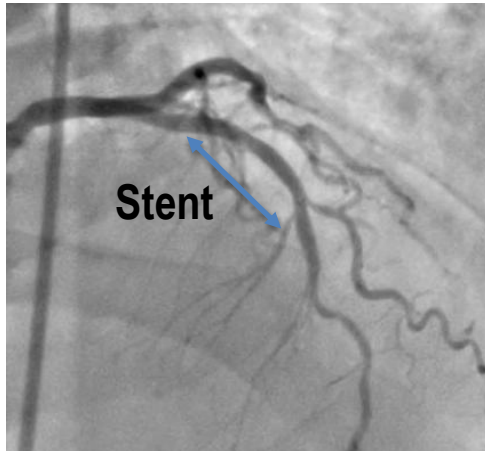


CT-derived computed FFR  
(FFR<sub>CT</sub>)

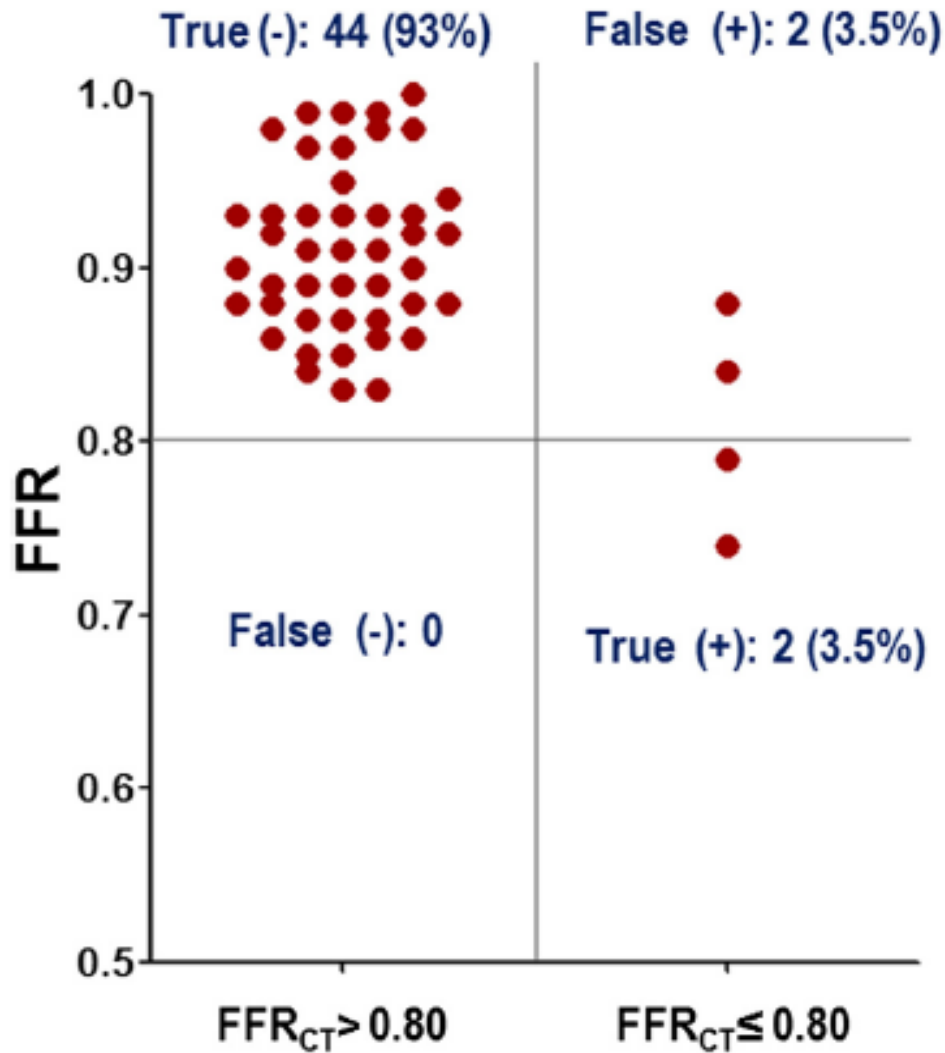


After Stenting

Stent



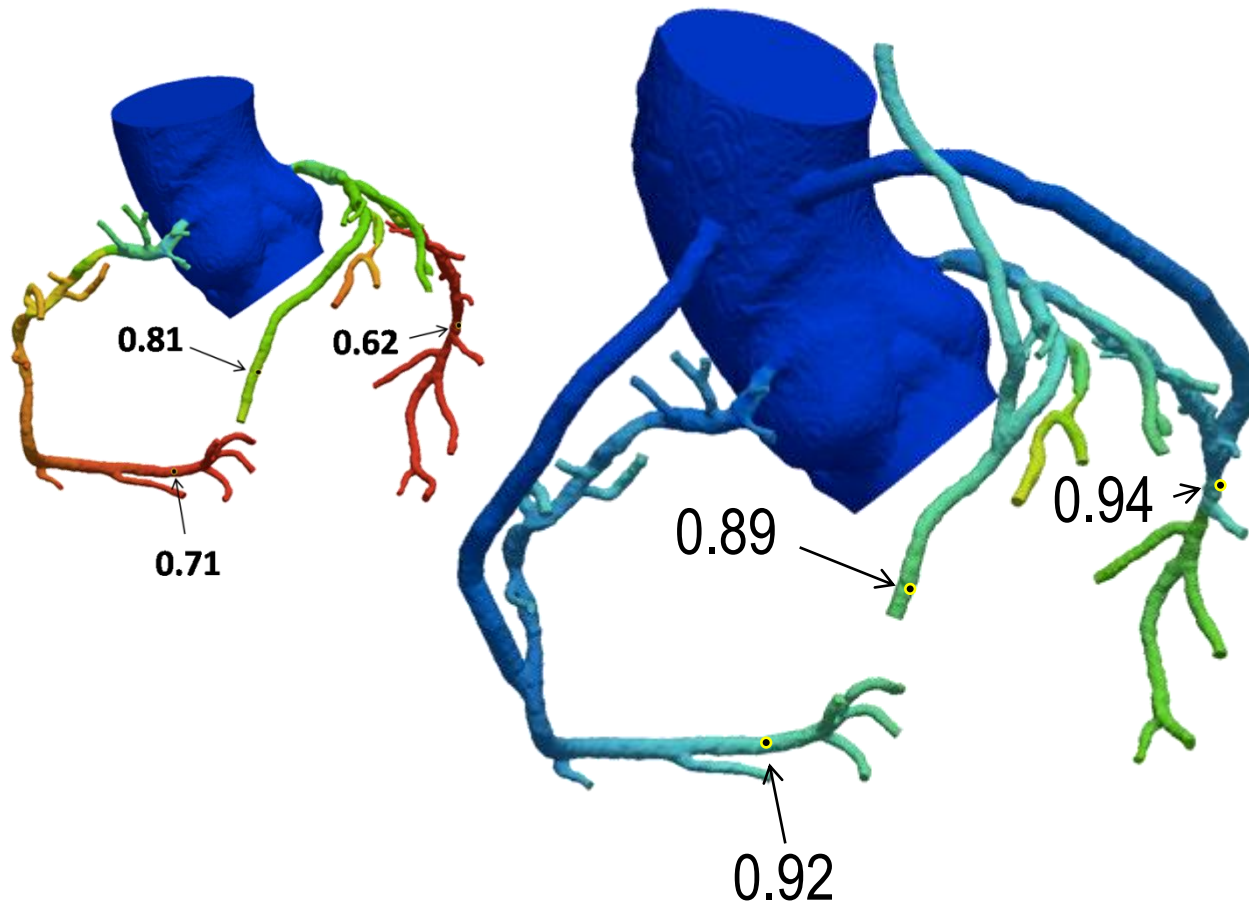
# Diagnostic performance of FFR<sub>CT</sub> after virtual stenting to predict the residual ischemia



Kim KH, Koo BK, et al. JACC interv 2014

# Virtual surgery before the surgery, with your computer

$FFR_{CT}$  after one arterial graft and 2 saphenous vein grafts





# Non-invasive hemodynamic measurement : Can we do more?

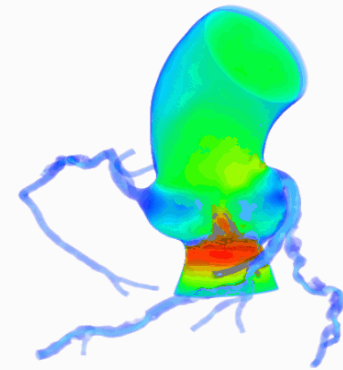
Coronary CT angiography + Computational fluid dynamics



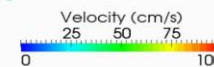
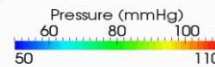
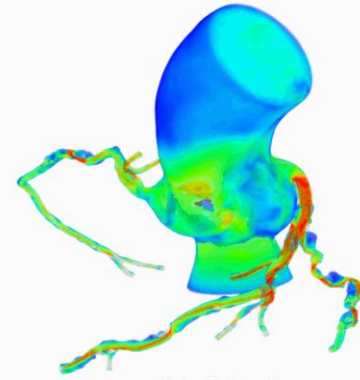
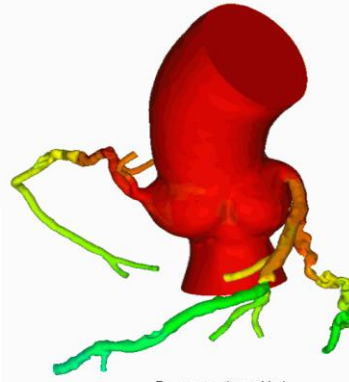
Rest

Pressure

Velocity



Hyperemia

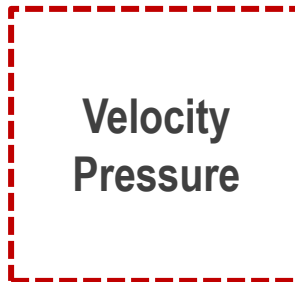




# Non-invasive hemodynamic force measurement : Is this feasible?

Coronary CT angiography + Computational fluid dynamics

**Simulation**



**Cauchy Stress Tensor**

$$\mathbf{T} = -p\mathbf{I} + \mu((\nabla\mathbf{v}) + (\nabla\mathbf{v})^T)$$

**Traction vector**

$$\mathbf{t} = \mathbf{T}\mathbf{n} = -p\mathbf{n} + \mu((\nabla\mathbf{v}) + (\nabla\mathbf{v})^T)\mathbf{n}$$

**Wall Shear Stress (WSS)**

$$\tau_{mean} = \left| \frac{1}{T} \int_0^T t_s dt \right|$$

$$t_s = t - (t \cdot n)n$$

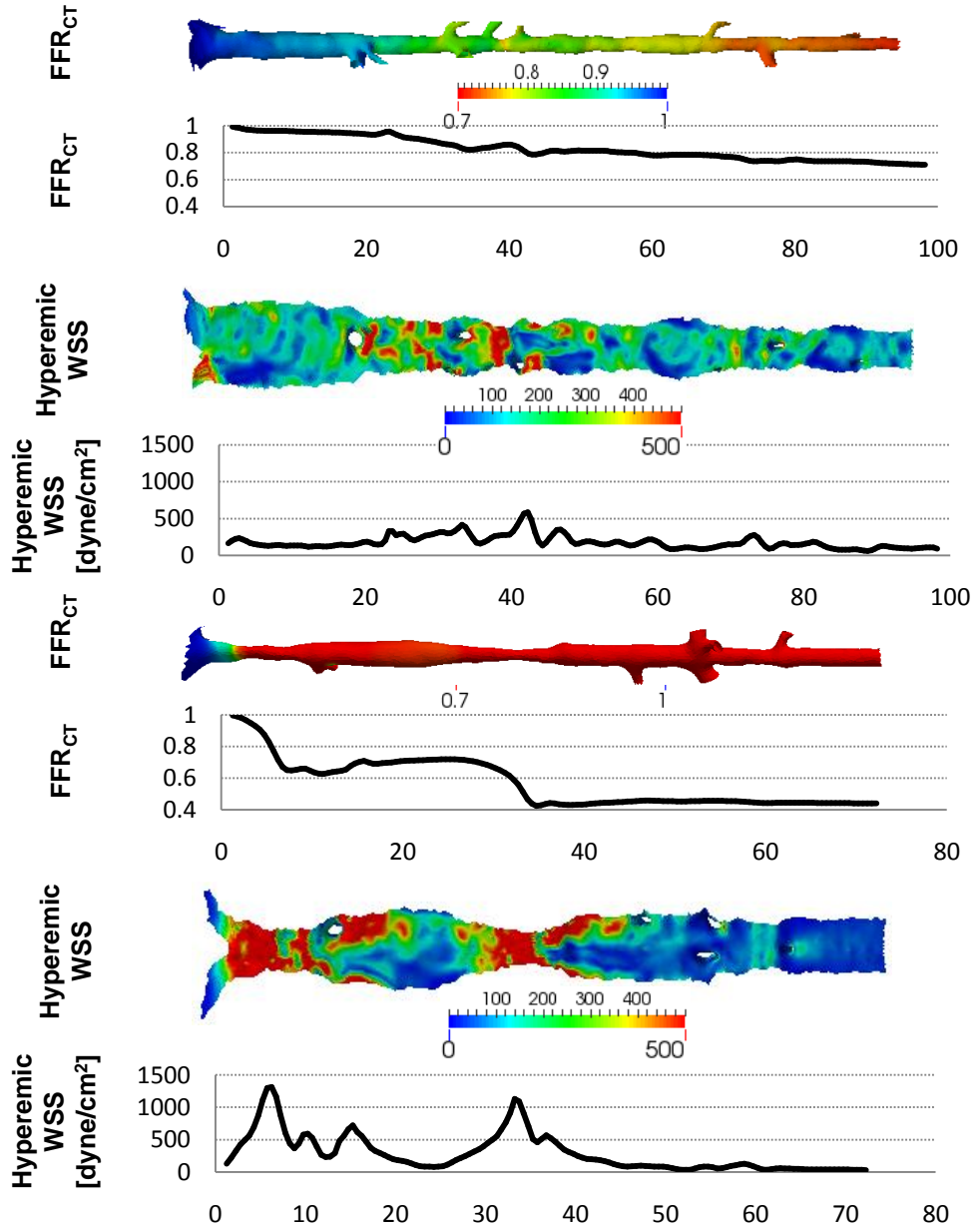
**Oscillatory Shear Index (OSI)**

$$OSI = \frac{1}{2} \left( 1 - \frac{\left| \frac{1}{T} \int_0^T t_s dt \right|}{\frac{1}{T} \int_0^T |t_s| dt} \right)$$

**Particle Residence Time,  
Turbulent Kinetic Energy,**

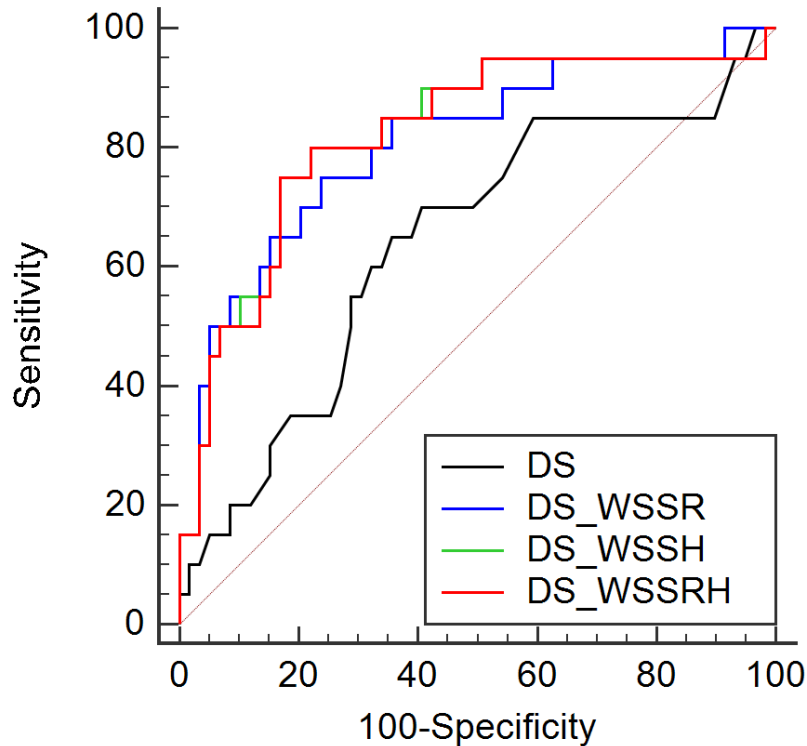
...

# Non-invasive WSS assessment using cCTA and CFD

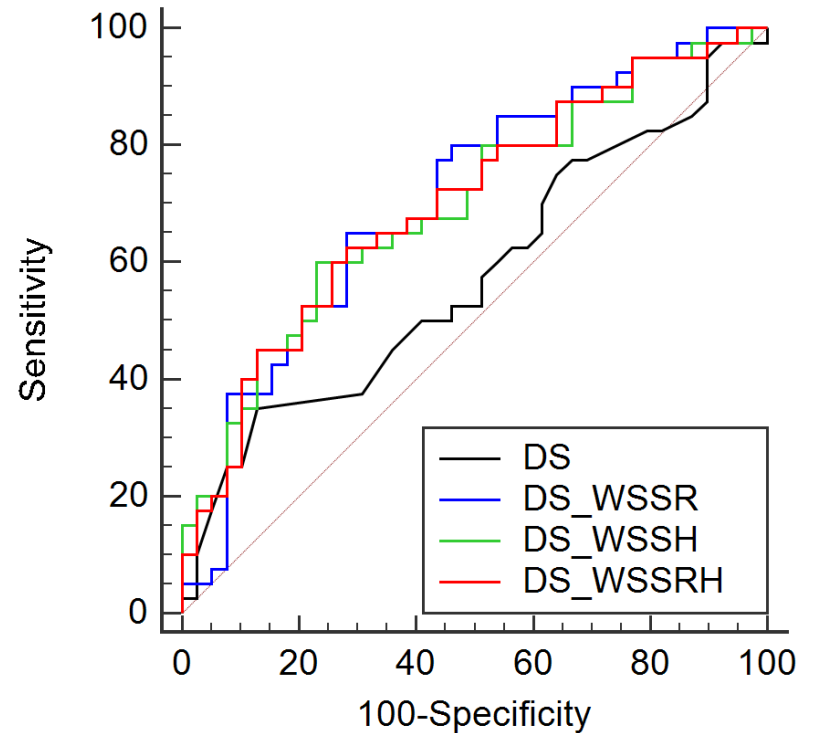


# Association with Adverse plaque characteristics : WSS vs. % diameter stenosis

## Napkin ring sign

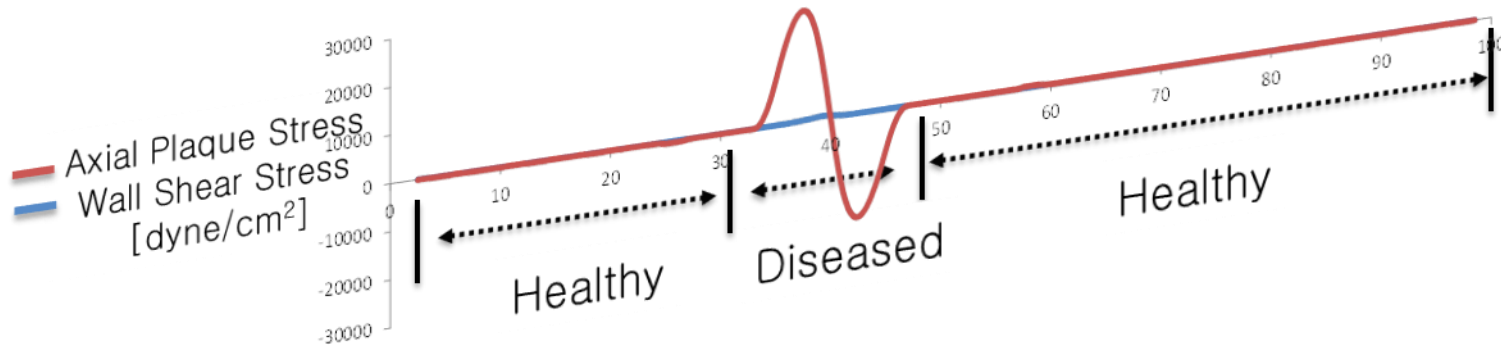
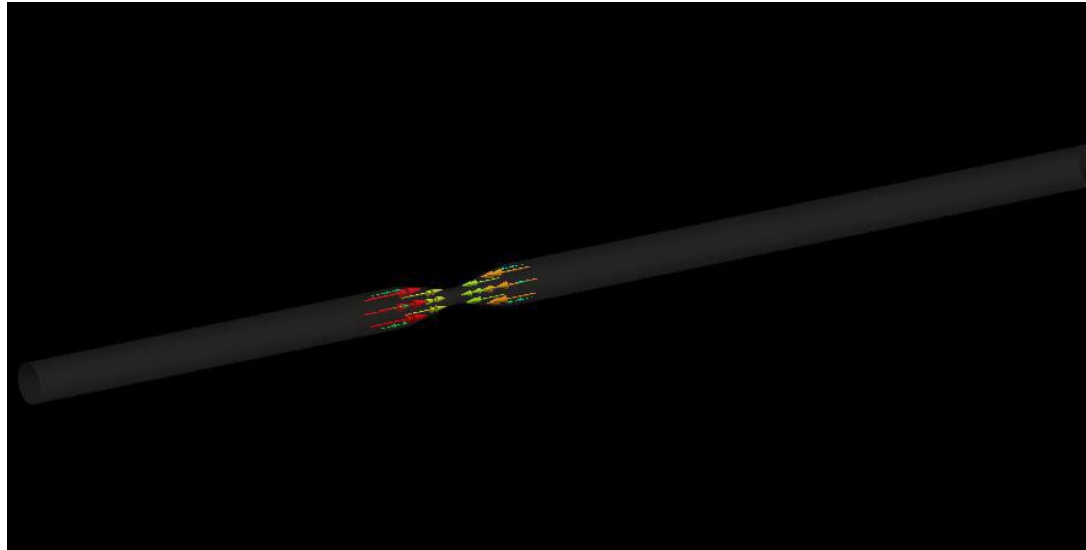


## Positive remodeling



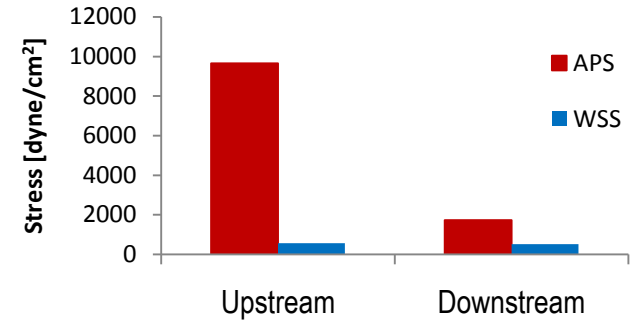
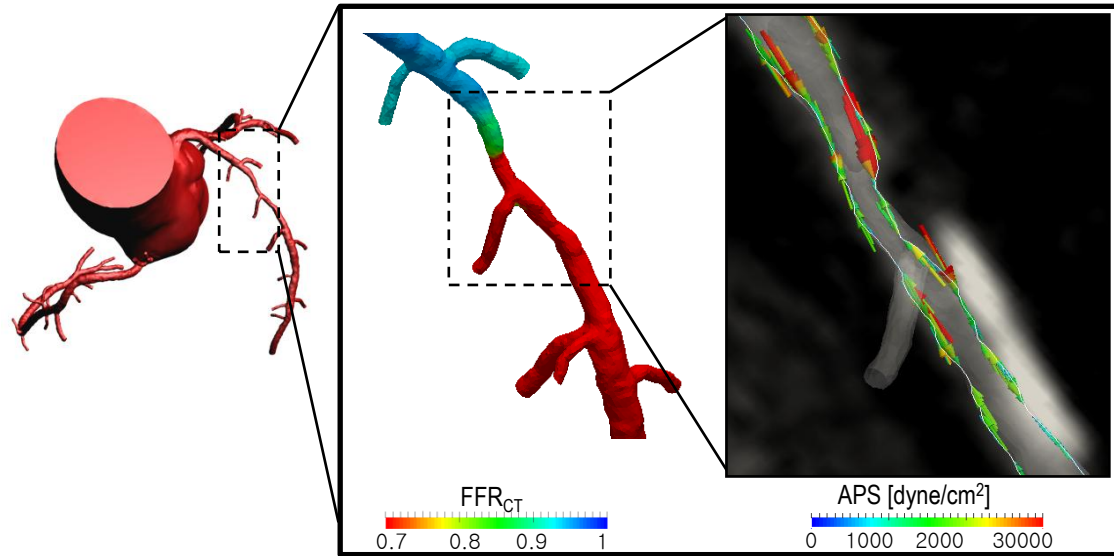
**DS:** % diameter stenosis, **WSSR:** resting wall shear stress, **WSSH:** hyperemic wall shear stress

# Novel hemodynamic index: Axial Plaque Stress

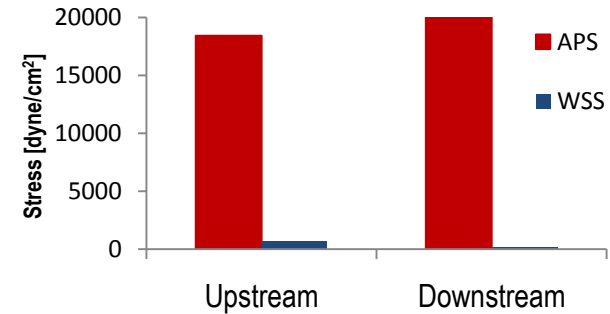
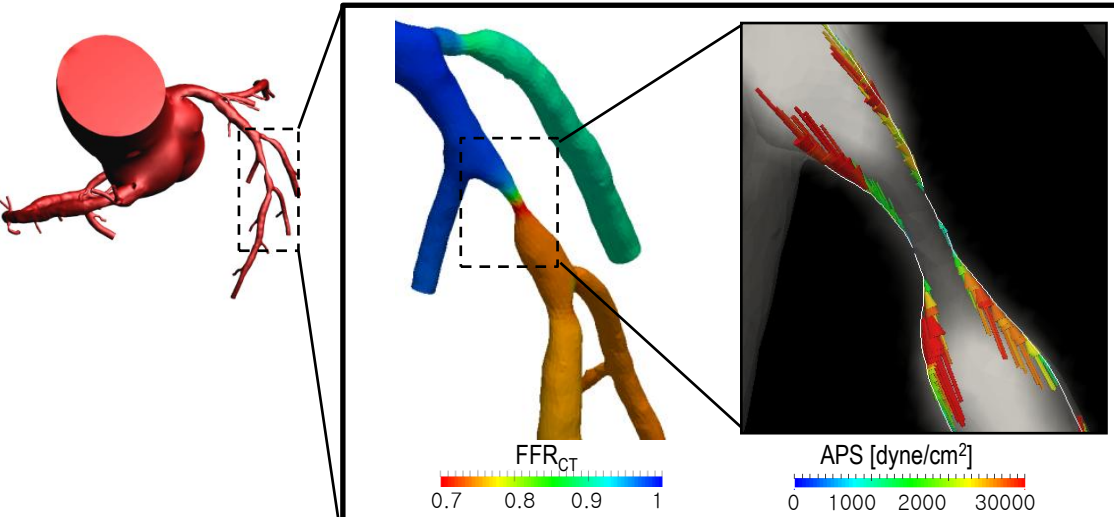


**Axial plaque stress** uniquely characterizes the diseased segment of both upstream and downstream.

# Distribution of Axial Plaque Stress in patients



	Upstream	Downstream
Radius Gradient	0.14	0.049
APS  (dyne/cm <sup>2</sup> )	9660	1740



	Upstream	Downstream
Radius Gradient	0.14	0.22
APS  (dyne/cm <sup>2</sup> )	18428	21383

# Influence of “Lesion Shape” on Hemodynamic Parameters (n=114)

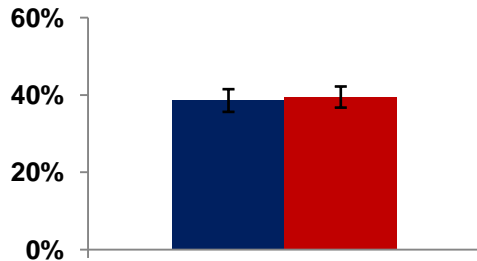


Upstream-dominant lesion  
(n=56)

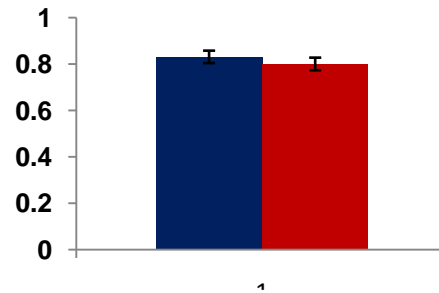


Downstream-dominant lesion  
(n=58)

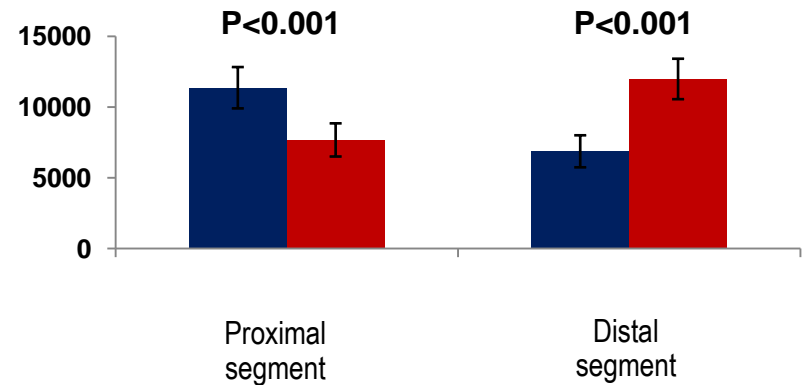
% Diameter Stenosis



FFR<sub>CT</sub>



| Axial Plaque Stress | (dyne/cm<sup>2</sup>)

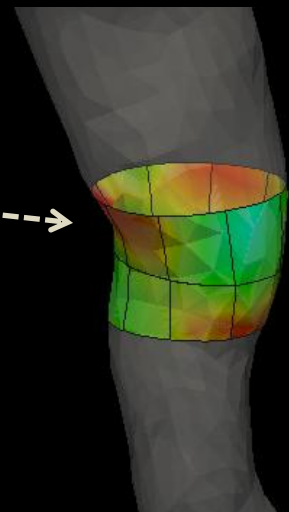
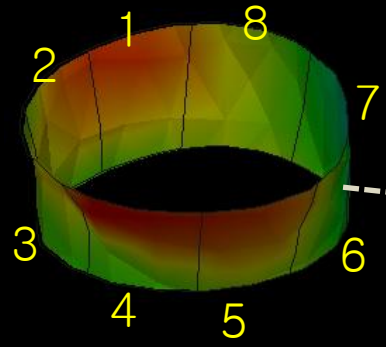
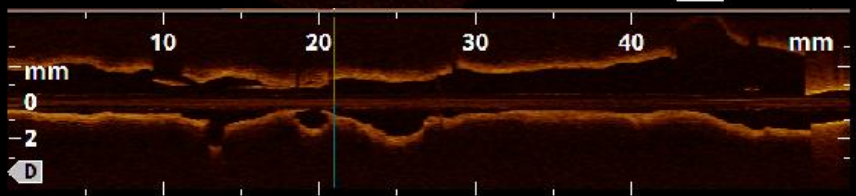
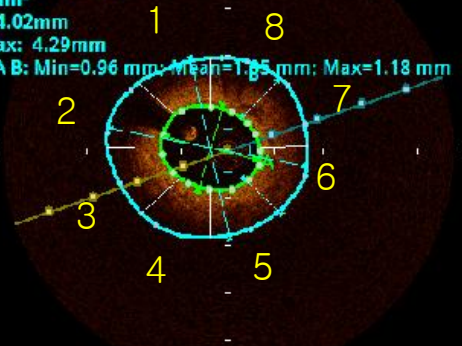




# Frame 106

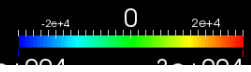
2012/06/19 9:27:16  
0106 (22 mm)

B Stent Area: 12.71mm<sup>2</sup>  
Mean Diameter: 4.02mm  
Min: 3.75mm Max: 4.29mm  
C Neointimal Thick A B: Min=0.96 mm, Mean=1.65 mm, Max=1.18 mm



Frame 106  
Frame 101  
Frame 96

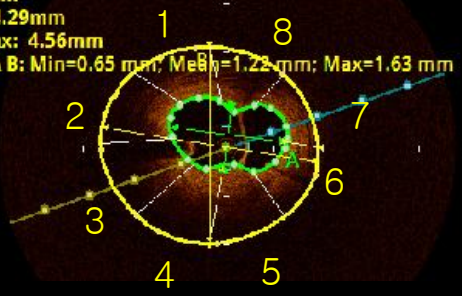
APS (dyne/cm<sup>2</sup>)



# Frame 96

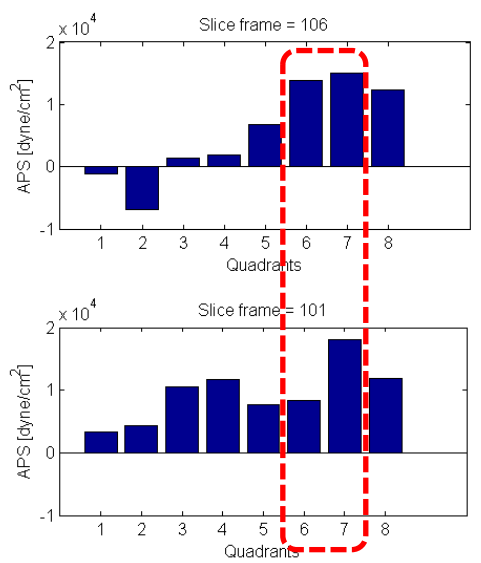
2012/06/19 9:27:16  
0096 (20 mm)

r: 1.86mm  
Max: 2.46mm  
18mm<sup>2</sup>  
r: 4.29mm  
Max: 4.56mm  
ck A B: Min=0.65 mm, Mean=1.22 mm, Max=1.63 mm

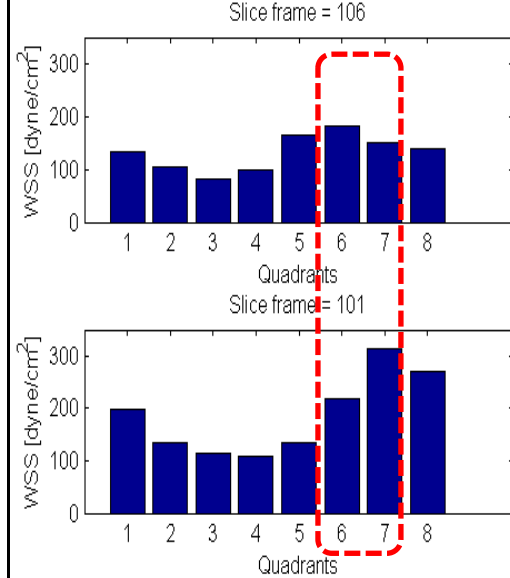


Plaque rupture  
at segments 6 and 7

## Axial Plaque Stress (APS)

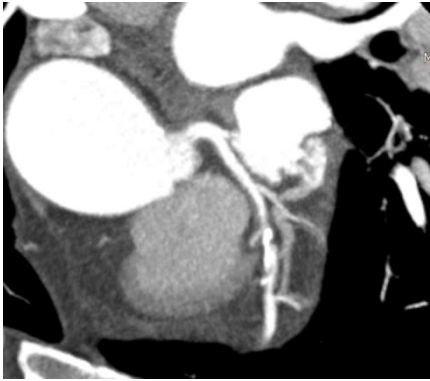


## Wall Shear Stress (WSS)



# APS and Future Event: CASE

2011-04 CT, Asymptomatic

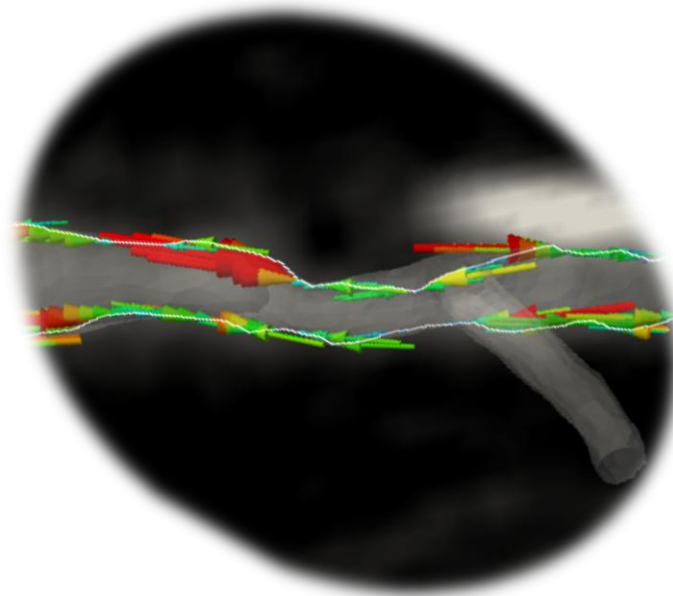
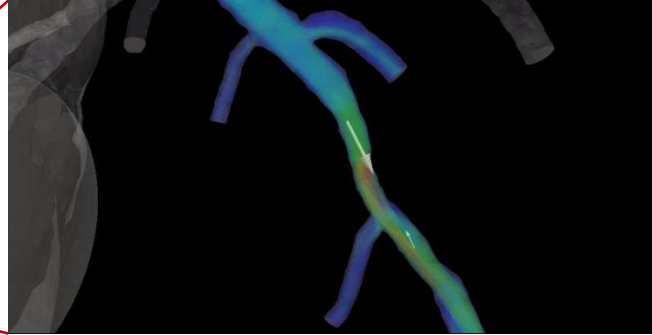
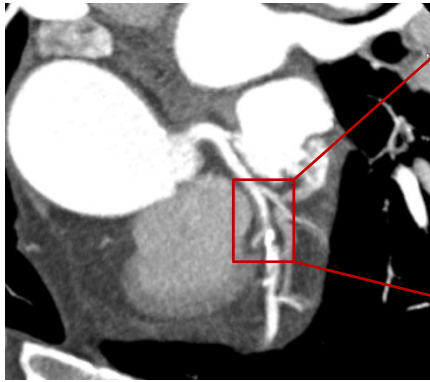


2012-06 Acute MI



# APS and Future Event: CASE

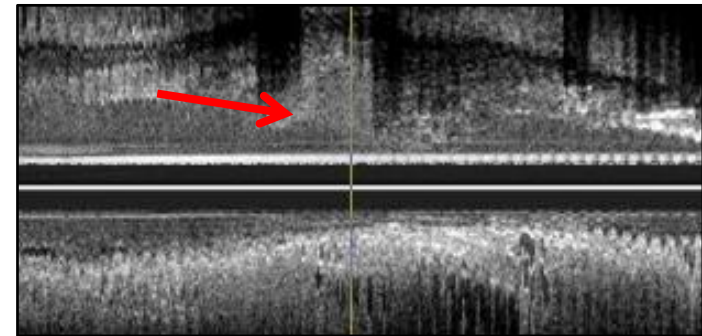
2011-04 CT, Asymptomatic



2012-06 Acute MI



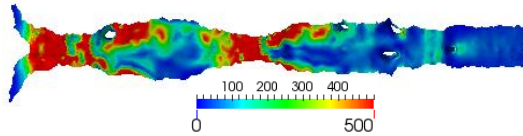
APS	
Upstream	9960 dyne/cm <sup>2</sup>
Downstream	1740 dyne/cm <sup>2</sup>



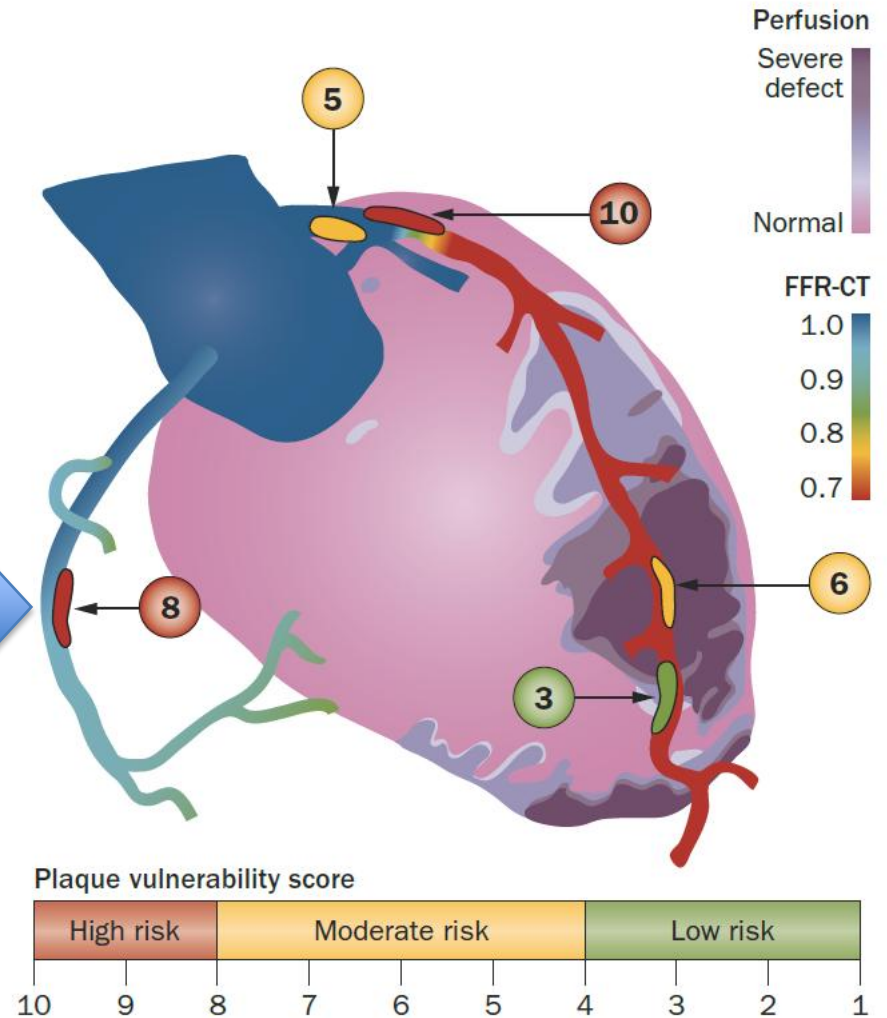
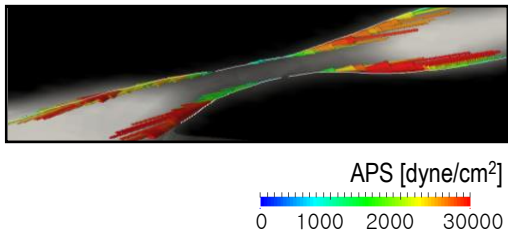
# Comprehensive non-invasive assessment for CAD using cCTA and CFD

## Non-invasive hemodynamic assessment

- Wall shear stress



- Axial plaque stress



# Acknowledgement

**HeartFlow, USA:** Charles Taylor, PhD, Gilwoo Choi, PhD, Hyun Jin Kim, PhD

**Seoul National University, Korea:** Jun-Bean Park, MD, Do-Yeon Hwang, MD, Kyung-Jin Kim, MD

**Samsung Medical Center, Korea:** , Joo-Myoung Lee, MD

**Inje university, Korea:** Joon-Hyung Doh, MD, PhD

**Keimyung university, Korea:** Chang-Wook Nam, MD, PhD

**Ulsan university , Korea:** Eun-Seok Shin, MD, PhD

**Kobe university, Japan:** Hiromasa Otake, MD, PhD

