

Results

Prediction of coronary artery disease based on facial temperature information captured by non-contact infrared thermography

Figure 1: Flow chart of the study dataset and design

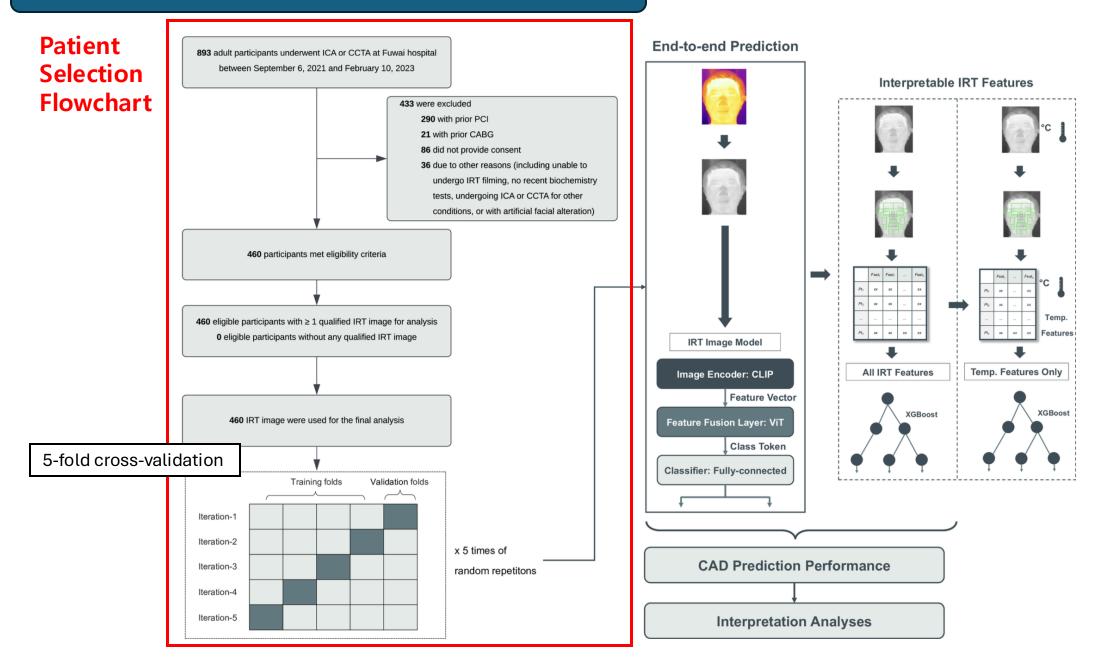


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End-to-end Prediction Model

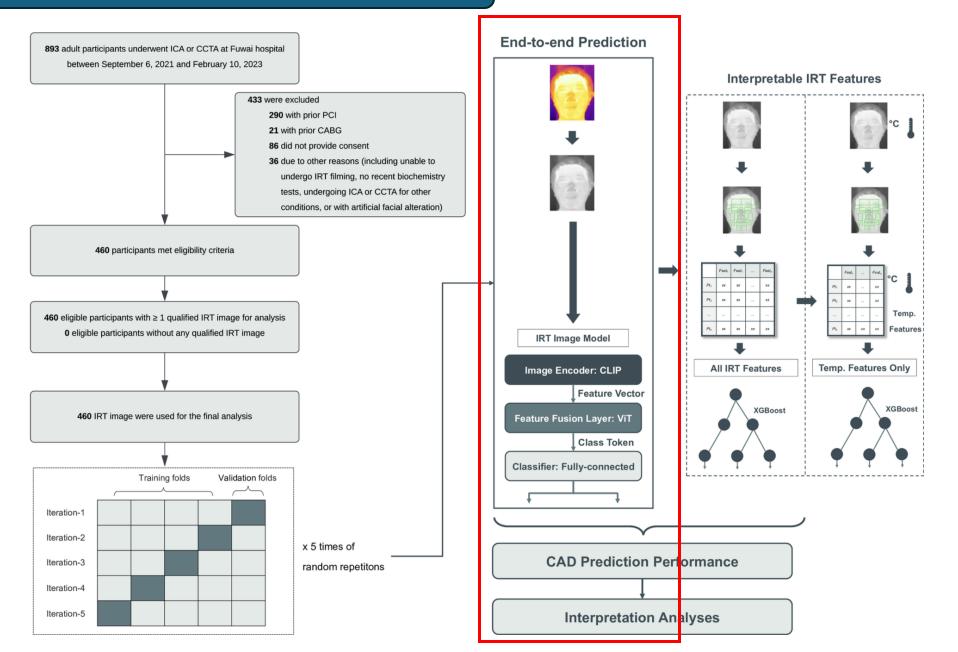
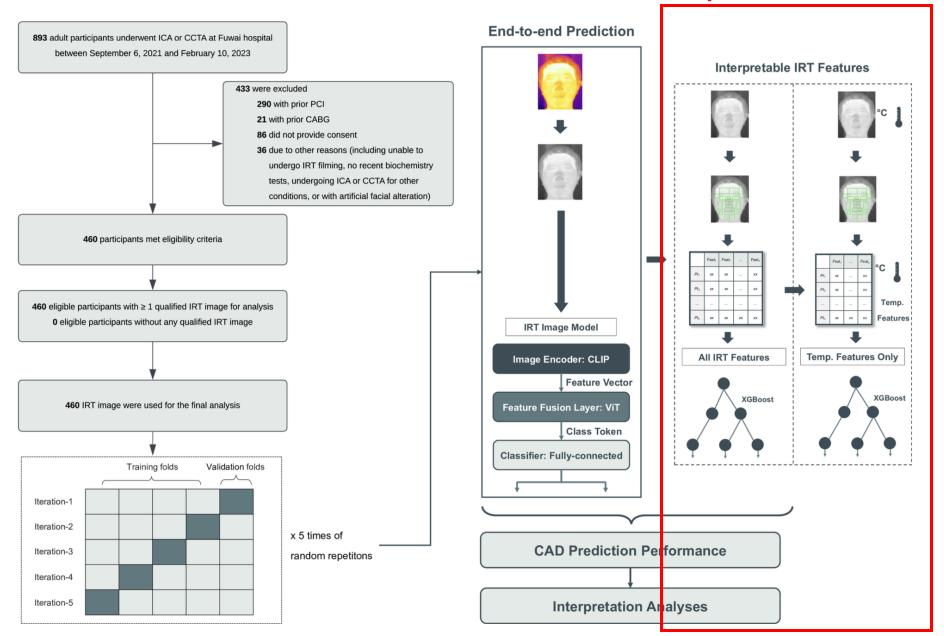


Figure 1: Flow chart of the study dataset and design

Interpretable IRT Features Models



		เปนโรคหลอด	ไม่เปนโรคหลอด	
Table 1 Baseline characteristics		เลือดหัวใจ	เลือดหัวใจ	
	Overall (n=460)	CAD (n=322)	No CAD (n=138)	P value
Age, mean (SD)	58.4 (10.4)	60.4 (9.7)	53.8 (10.6)	<0.001
Female sex, n (%)	126 (27.4)	74 (23.0)	52 (37.7)	0.002
Smoking, n (%)	219 (47.6)	177 (55.0)	42 (30.4)	<0.001
BMI, mean (SD)	25.5 (3.0)	25.6 (3.0)	25.2 (3.0)	0.155
Menopause, n (%)	107 (84.9)	71 (95.9)	36 (69.2)	<0.001
Early ASCVD family history, n (%)	18 (3.9)	15 (4.7)	3 (2.2)	0.128
Hypertension, n (%)	267 (58.0)	215 (66.8)	52 (37.7)	<0.001
Hyperlipidaemia, n (%)	348 (75.7)	295 (91.6)	53 (38.4)	<0.001
Diabetes mellitus, n (%)	112 (24.3)	96 (29.8)	16 (11.6)	<0.001
Cerebrovascular event, n (%)	67 (14.6)	59 (18.3)	8 (5.8)	0.001
Peripheral artery disease, n (%)	48 (10.4)	44 (13.7)	4 (2.9)	0.001
Congestive heart failure, n (%)	63 (13.7)	32 (9.9)	31 (22.5)	0.001
Chronic kidney disease, n (%)	5 (1.1)	4 (1.2)	1 (0.7)	1.00
COPD, n (%)	7 (1.5)	5 (1.6)	2 (1.4)	1.00
Atrial Fibrillation, n (%)	35 (7.6)	21 (6.5)	14 (10.1)	0.250
Chronic inflammatory disease, n (%)	18 (3.9)	14 (4.3)	4 (2.9)	0.637
CAD symptoms, n (%)				
No symptoms	77 (16.7)	42 (13.0)	35 (25.4)	0.002
Non-anginal	102 (22.2)	70 (21.7)	32 (23.2)	
Atypical	146 (31.7)	102 (31.7)	44 (31.9)	
Typical	135 (29.3)	108 (33.5)	27 (19.6)	

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Atrial Fibrillation, n (%)	35 (7.6)	21 (6.5)	14 (10.1)	0.250
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อาการของโรค หลอดเลือดหัวใจ (CAD)

การใชยา

Table 1 Baseline characteristics

	Overall	CAD	No CAD		
	(n=460)	(n=322)	(n=138)	P value	
Regular medications					
Aspirin, n (%)	191 (41.5)	173 (53.7)	18 (13.0)	<0.001	
Beta blocker, n (%)	116 (25.2)	92 (28.6)	24 (17.4)	0.016	
Statin, n (%)	210 (45.7)	173 (53.7)	37 (26.8)	<0.001	
Nonstatin lipid-lowering drugs, n (%)	11 (2.4)	7 (2.2)	4 (2.9)	0.740	
ACEI/ARB, n (%)	125 (27.2)	103 (32.0)	22 (15.9)	0.001	
CCB, n (%)	121 (26.3)	94 (29.2)	27 (19.6)	0.042	
Fast glucose, mean (SD)	6.3 (2.0)	6.5 (2.2)	5.7 (1.3)	<0.001	
Total cholesterol, mean (SD)	4.3 (1.2)	4.2 (1.2)	4.7 (1.1)	<0.001	
Triglyceride, mean (SD)	1.7 (1.7)	1.7 (1.9)	1.5 (0.9)	0.058	
HDL, mean (SD)	1.2 (0.3)	1.2 (0.3)	1.3 (0.3)	<0.001	
LDL, mean (SD)	2.5 (1.0)	2.4 (0.9)	2.9 (1.0)	<0.001	
Haemoglobin A1c%, mean (SD)	6.3 (1.2)	6.4 (1.2)	5.9 (0.7)	<0.001	
ESR, mean (SD)	8.0 (9.6)	8.3 (10.2)	6.7 (5.8)	0.069	
CRP, mean (SD)	3.6 (5.2)	3.7 (5.5)	3.0 (3.4)	0.231	
LVEF, mean (SD)	63.2 (6.2)	62.5 (6.6)	65.1 (4.5)	<0.001	
Coronary confirmatory exam, n (%)				<0.001	
ICA	379 (82.4)	310 (96.3)	69 (50.0)		
CCTA	81 (17.6)	12 (3.7)	69 (50.0)		
Coronary Lesion severity, n (%)					
No coronary stenosis >50%	138 (30.0)	/	138 (100.0)		
One vessel	89 (19.3)	89 (27.6)	/		
Two vessels	74 (16.1)	74 (23.0)	/		
Left main or three or more vessels	159 (34.6)	159 (49.4)	/		

ACEI/ARB, ACE inhibitor or angiotensin receptor blocker; ASCVD, atherosclerotic cardiovascular diseases; BMI, body mass index; CAD, coronary artery disease; CCB, calcium channel blocker; CCTA, coronary CT angiography; COPD, chronic obstructive pulmonary disease; CRP, C reactive protein; ESR, erythrocyte sedimentation rate; HDL, high-density lipoprotein; ICA, invasive coronary angiography; LDL, low-density lipoprotein; Lp(a), lipoprotein(a); LVEF, left ventricular ejection fraction.

Table 1

Two vessels

Left main or three or more vessels

Baseline characteristics

CAD No CAD Overall (n=460) (n=322)(n=138) P value Regular medications 191 (41.5) 173 (53.7) 18 (13.0) < 0.001 Aspirin, n (%) Beta blocker, n (%) 116 (25.2) 92 (28.6) 24 (17.4) 0.016 37 (26.8) < 0.001 Statin, n (%) 210 (45.7) 173 (53.7) Nonstatin lipid-lowering drugs, n (%) 11 (2.4) 7 (2.2) 4 (2.9) 0.740 ACEI/ARB, n (%) 125 (27.2) 103 (32.0) 22 (15.9) 0.001 CCB, n (%) 121 (26.3) 94 (29.2) 27 (19.6) 0.042 Fast glucose, mean (SD) 6.3 (2.0) 6.5 (2.2) 5.7 (1.3) < 0.001 Total cholesterol, mean (SD) 4.2 (1.2) 4.7 (1.1) < 0.001 4.3 (1.2) 0.058 Triglyceride, mean (SD) 1.7 (1.7) 1.7 (1.9) 1.5 (0.9) HDL, mean (SD) 1.2 (0.3) 1.2 (0.3) 1.3 (0.3) < 0.001 LDL, mean (SD) 2.4 (0.9) 2.9 (1.0) < 0.001 2.5 (1.0) Haemoglobin A1c%, mean (SD) 6.4 (1.2) 6.3 (1.2) 5.9 (0.7) < 0.001 ESR, mean (SD) 8.0 (9.6) 8.3 (10.2) 6.7 (5.8) 0.069 CRP, mean (SD) 3.6 (5.2) 3.7 (5.5) 3.0 (3.4) 0.231 LVEF, mean (SD) 63.2 (6.2) 62.5 (6.6) 65.1 (4.5) < 0.001 < 0.001 Coronary confirmatory exam, n (%) **ICA** 379 (82.4) 310 (96.3) 69 (50.0) CCTA 81 (17.6) 12 (3.7) 69 (50.0) < 0.001 Coronary Lesion severity, n (%) No coronary stenosis >50% 138 (30.0) 138 (100.0) 89 (19.3) 89 (27.6) One vessel

ACEI/ARB, ACE inhibitor or angiotensin receptor blocker; ASCVD, atherosclerotic cardiovascular diseases; BMI, body mass index; CAD, coronary artery disease; CCB, calcium channel blocker; CCTA, coronary CT angiography; COPD, chronic obstructive pulmonary disease; CRP, C reactive protein; ESR, erythrocyte sedimentation rate; HDL, high-density lipoprotein; ICA, invasive coronary angiography; LDL, low-density lipoprotein; Lp(a), lipoprotein(a); LVEF, left ventricular ejection fraction.

74 (23.0)

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ผลตรวจทาง

ชองปฏิบัติการ

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ผลการวินิจฉัเ

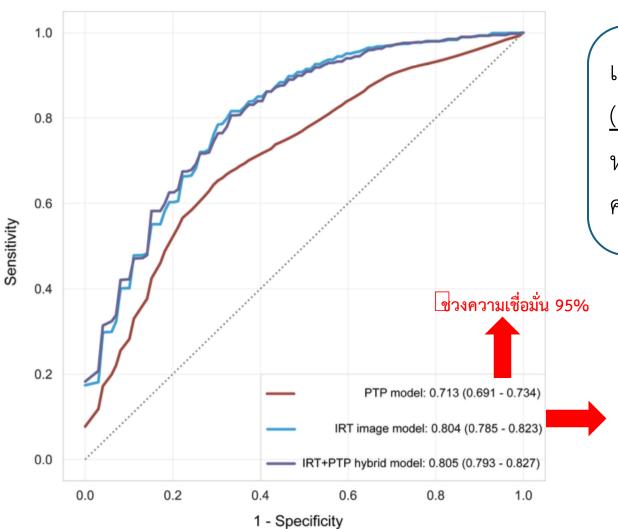
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ความรุนแรง ของโรค

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Figure 2:Receiver operating characteristic curves of models performance for CAD prediction.

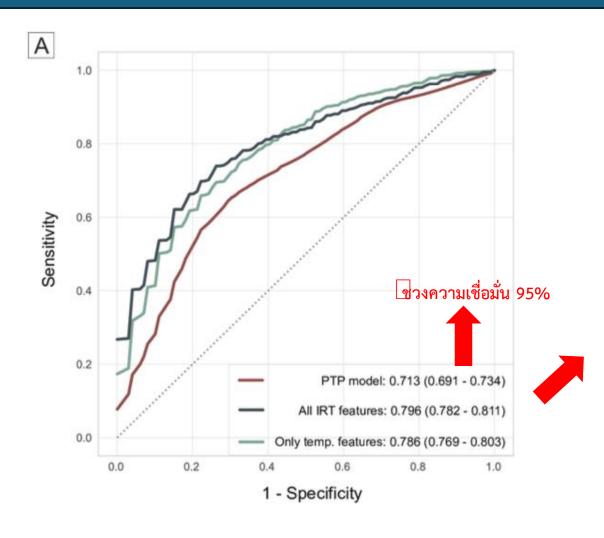


แบบจำลอง AI ที่วิเคราะห์จากภาพถ่ายอุณหภูมิใบหน้า (IRT image model) มีประสิทธิภาพในการทำนายโรค หลอดเลือดหัวใจได**้ดีกวา**วิธีการประเมินความเสี่ยงทาง คลินิกแบบดั้งเดิม (PTP model) อย่างมีนัยสำคัญ

จากกราฟ ROC Curve

- PTP model: AUC = 0.713
- IRT image model: AUC = 0.804
- IRT+PTP hybrid model: AUC = 0.805

Figure 3A: Predictive performance for using <u>all or traditional temperature- only IRT features</u> for CAD prediction, as <u>compared with the PTP model</u>

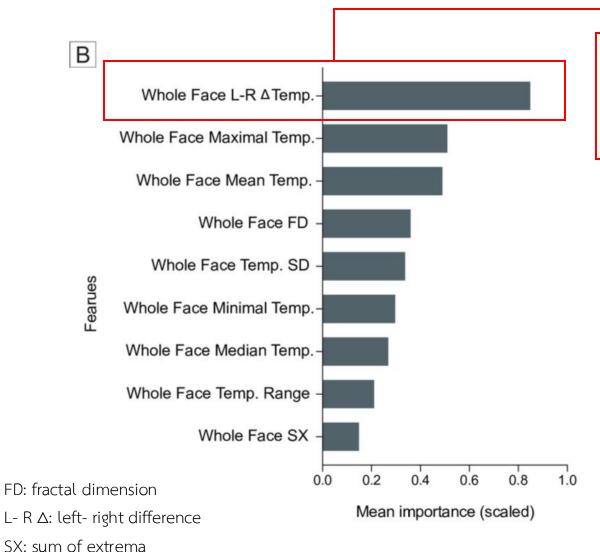


จากกราฟ ROC Curve

- PTP model: AUC = 0.713
- All IRT features: AUC = 0.796 (แบบจำลองที่ใช้ค่า features ที่สกัดจากภาพ IRT)
- Traditional temperature features: AUC = 0.786 (แบบจำลองที่ใช้เฉพาะข้อมูลอุณหภูมิพื้นฐานที่วัดได้จาก ภาพ)

งานวิจัยนี้สามารถสร้าง Model ที่สามารถทำนายโรค ได้ดีกว่าวิธีดั้งเดิม และสามารถบอกได้ว่า<u>ใช้ข้อมูลส่วน</u> ไหนในการตัดสินใจ (Interpretable Model)

Figure 3B: The ranking of the scaled importance value of the whole - face level features.



Δ: value difference.

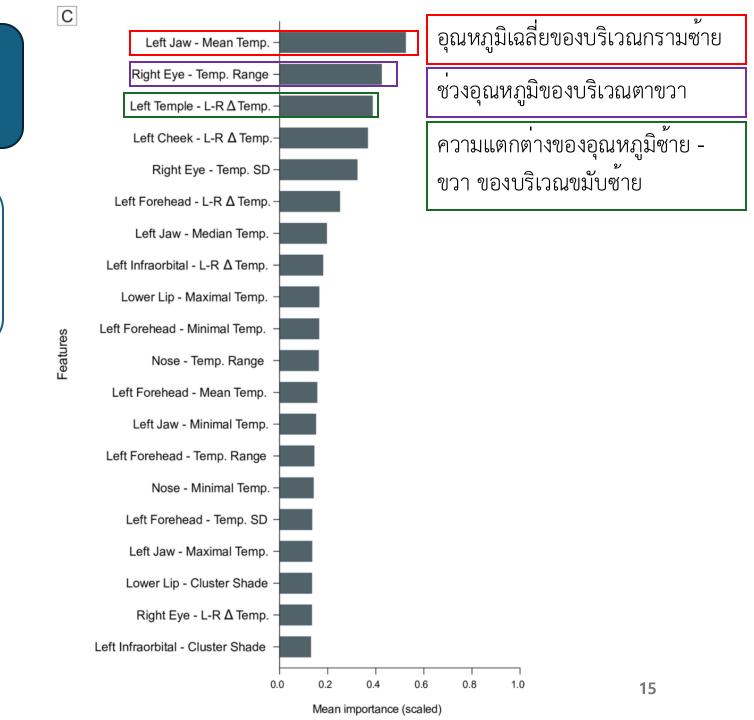
ความแตกต่างของอุณหภูมิระหว่างใบหนาซีกซายและซีกขวาโดยรวม แสดงว่าความไม่สมมาตรของอุณหภูมิ เป็นสัญญาณเตือนที่สำคัญของ โรคหลอดเลือดหัวใจ (CAD)

> เป็นการมองภาพรวมของทั้งใบหน้า เพื่อสรุป ว่า features ใดมีอิทธิพลสูงสุดในการทำนายโรค

> > 14

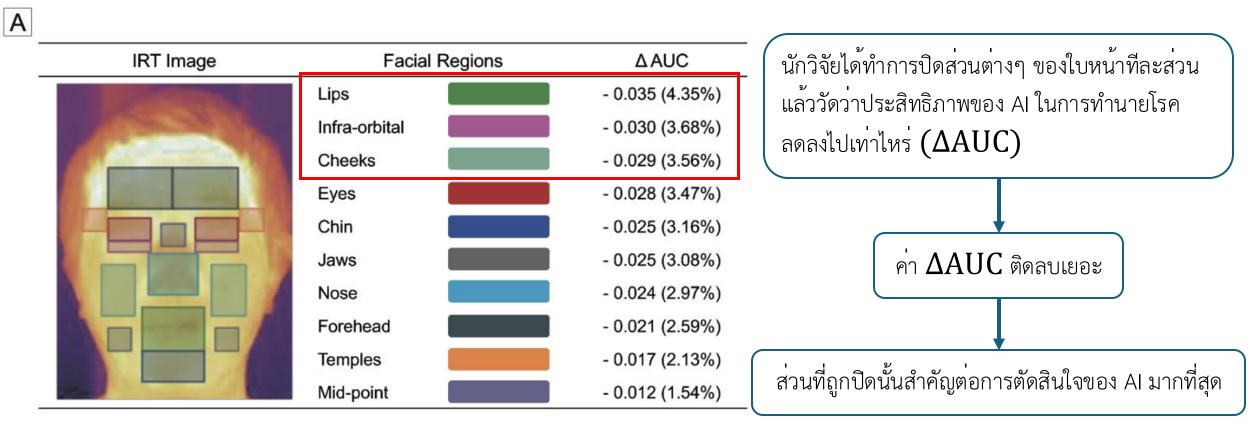
Figure 3C: The ranking of the scaled importance value of the top 20 region of interest (ROI) - level features.

จากข้อมูลทั้งหมดที่วัดได้จากภาพถ่ายอุณหภูมิใบหน้า จะ ดูในบริเวณเล็กๆ ที่น่าสนใจ 20 บริเวณ เพื่อดูว่า บริเวณใดที่ AI คิดว่าสำคัญที่สุดในการทำนายโรค



Interpretation and visualisation of the IRT image model

Figure 4A: Results of the occlusion tests in assessing the effect of individual facial regions after occlusion on the IRT image model's predictive performance, measured by the degree of AUC reduction (ΔAUC)



Al ให**้ความสำคัญกับ บริเวณกลางใบหนา (Central Face)** โดยเฉพาะ **รอบปาก, ใตตา, และแกม** เป็นพิเศษในการค้นหาสัญญาณของโรค

Figure 4B: Visualisation of examples with specific facial regions deemed important for IRT image model prediction highlighted by the Gradient - weighted Class Activation Map methods

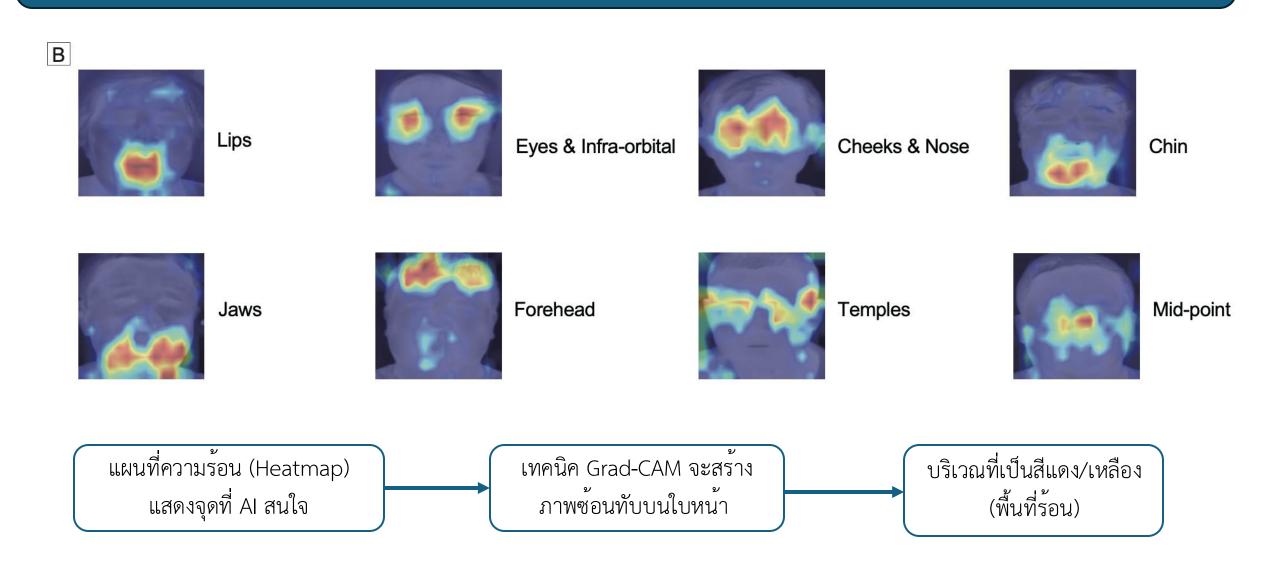


Figure 4C: Dose – response relationship between the CAD lesion severity and the IRT image model predicted CAD risk percentiles.

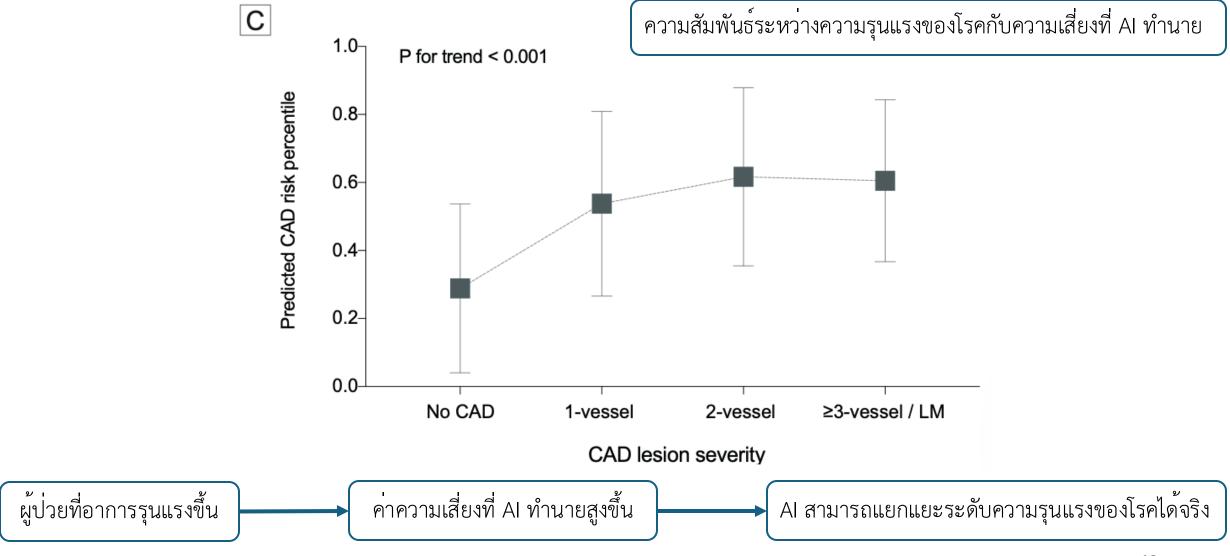


Table 2 IRT model prediction for surrogate la	(Mean Absolute Error)		
Surrogate labels	AUC (95% CI)	MAE (95% CI)	
ASCVD traditional risk factors			
Hyperlipidaemia	0.831 (0.811 to 0.850)	/	
Hypertension	0.640 (0.607 to 0.673)	/	
Diabetes mellitus	0.659 (0.573 to 0.745)	/	
Male	0.988 (0.985 to 0.991)	/	
Age	/	8.23 (7.543 to 8.914)	
Body mass index	/	2.593 (2.147 to 3.038)	
Smoking	0.749 (0.694 to 0.804)	/	
Early ASCVD family history	0.691 (0.587 to 0.795)	/	
HbA1C%	/	0.772 (0.686 to 0.859)	
Inflammation and other cardiovascular market	rs		
Chronic inflammatory diseases	0.631 (0.536 to 0.726)	/	
Elevated ESR level*	0.645 (0.524 to 0.766)	/	
Elevated Inflammatory Markers [†]	0.601 (0.539 to 0.663)	/	
NT-proBNP>300 pg/mL	0.636 (0.593 to 0.678)	/	

^{*}The elevated level refers to the laboratory value higher than the upper bound of reporting normal range. †Inflammatory markers include ESR, C reactive protein and Interleukin-6.

ASCVD, atherosclerotic cardiovascular diseases; AUC, area under the curve; CAD, coronary artery disease; CRP, C reactive protein; ESR, erythrocyte sedimentation rate; HbA1C%, Hemoglobin A1C%; IRT, infrared thermography; MAE, mean absolute error; NT-proBNP, N-terminal pro-B-type natriuretic peptide.

Table 2 IRT model prediction for surrogate labels contributing or related to CAD

Surrogate labels	AUC (95% CI)	MAE (95% CI)
ASCVD traditional risk factors		
Hyperlipidaemia	0.831 (0.811 to 0.850)	/
Hypertension	0.640 (0.607 to 0.673)	/
Diabetes mellitus	0.659 (0.573 to 0.745)	/
Male	0.988 (0.985 to 0.991)	/
Age	/	8.23 (7.543 to 8.914)
Body mass index	/	2.593 (2.147 to 3.038)
Smoking	0.749 (0.694 to 0.804)	/
Early ASCVD family history	0.691 (0.587 to 0.795)	/
HbA1C%	/	0.772 (0.686 to 0.859)
Inflammation and other cardiovascular markers		
Chronic inflammatory diseases	0.631 (0.536 to 0.726)	/
Elevated ESR level*	0.645 (0.524 to 0.766)	/
Elevated Inflammatory Markers [†]	0.601 (0.539 to 0.663)	/
NT-proBNP>300 pg/mL	0.636 (0.593 to 0.678)	/

^{*}The elevated level refers to the laboratory value higher than the upper bound of reporting normal range. †Inflammatory markers include ESR, C reactive protein and Interleukin-6.

ASCVD, atherosclerotic cardiovascular diseases; AUC, area under the curve; CAD, coronary artery disease; CRP, C reactive protein; ESR, erythrocyte sedimentation rate; HbA1C%, Hemoglobin A1C%; IRT, infrared thermography; MAE, mean absolute error; NT-proBNP, N-terminal pro-B-type natriuretic peptide.

