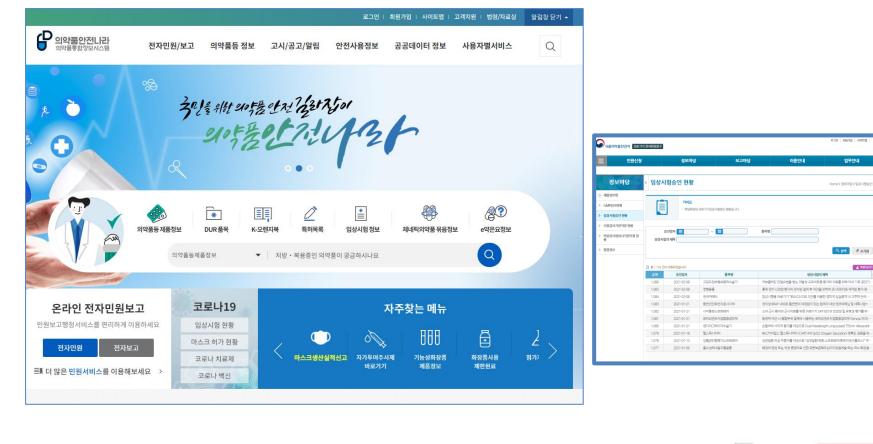


심혈관질환에서 인공지능 소프트웨어

Seoul National University College of Medicine Dong-Ju Choi, MD. PhD



Introduction



로그만 회원가입 사이트면

업무안내

Home > 정보마당 > 임상시험승인 현황

Q 214 @ a718

T destruct



What is Digital Health?

4

Introduction

US FDA (SaMD) Software as a Medica Device



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Software as a Medical Device (SaMD)

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Software as a Medical Device (SaMD)

Artificial Intelligence and Machine Learning in Software as a Medical Device

What are examples of

Software as a Medical

Global Approach to

Software as a Medical

Device?

Device

important part of all products, integrated widely into digital platforms that serve both medical and non-medical purposes. Software, which on its own is a medical device – Software as a Medical Device – is one of three types of software related to medical devices. The other two types of software related to medical devices include software that is integral to a medical device (Software in a medical device) and software used in the manufacture or maintenance of a medical device.

As technology continues to advance all facets of health care, software has become an

What is Software as a Medical Device?

The term Software as a Medical Device 3 is defined by the International Medical Device Regulators Forum (IMDRF) as "software intended to be used for one or more medical purposes that perform these purposes without being part of a hardware medical device."

Use of Software as a Medical Device is continuing to increase. It can be used across a broad range of technology platforms, including medical device platforms, commercial "off-the-shelf" platforms, and virtual networks, to name a few. Such software was previously referred to by industry, international regulators, and health care providers as "standalone software," "medical device software," and/or "health software," and can sometimes be confused with other types of software.

How are Regulators Addressing the Challenges with Software as a Medical Device?

US FDA (AI/ML SaMD) AI/ML Software as a Medica Device

FDA U.S. FOOD & DRUG Q Search ≡ Me - Home / Medical Devices / Digital Health Center of Excellence / Software as a Medical Device (SaMD) / Artificial Intelligence and Machine Learning in Software as a Medical Device Artificial Intelligence and Machine Learning in Software as a Medical Device Subscribe to Email Updates 🕴 Share 🎔 Tweet 🛛 In Linkedin 🔤 Email 🖨 Print Software as a Medical Content current as of: Device (SaMD) 01/12/2021 Artificial Intelligence and Machine Learning (AI/ML) Software as a Medical Device Regulated Product(s) Artificial Intelligence and Machine Learning Medical Devices Action Plan in Software as a The U.S. Food and Drug Administration (FDA) issued the "Artificial Medical Device Intelligence/Machine Learning (AI/ML)-Based Software as a Medical Device (SaMD) Action Plan" from the Center for Devices What are examples of Software as a Medical and Radiological Health's Digital Health Center of Excellence. Device? The Action Plan is a direct response to stakeholder feedback to the April 2019 discussion paper. "Proposed Regulatory Framework for Global Approach to Modifications to Artificial Intelligence/Machine Learning-Based Software as a Medical Software as a Medical Device" and outlines five actions the FDA Device intends to take. Download Action Plan (PDF - 747 KB)

Introduction

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A U.S. FOOD & DRUG ADMINISTRATION

Artificial Intelligence/Machine Learning (AI/ML)-Based Software as a Medical Device (SaMD) Action Plan

January 2021



AI/ML SOFTWARE AS A MEDICAL DEVICE ACTION PLAN

- 1. Tailored Regulatory Framework for AI/ML-based SaMD
- 2. Good Machine Learning Practice (GMLP)
- 3. Patient-Centered Approach Incorporating Transparency to Users
- 4. Regulatory Science Methods Related to Algorithm Bias & Robustness
- 5. Real-World Performance (RWP)

What we heard: Stakeholders described the need for clarity on Real-World Performance (RWP) monitoring for AI/ML software.

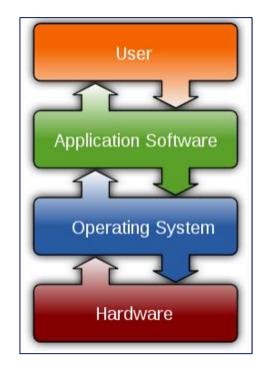
What we'll do: Work with stakeholders who are piloting the RWP process for AI/ML-based SaMD



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Introduction

Softwarer is a collection of instructions and **data** that tell computer how to work, including computer programs, libraries, and related non-executable data, such as online documentation or digital media.



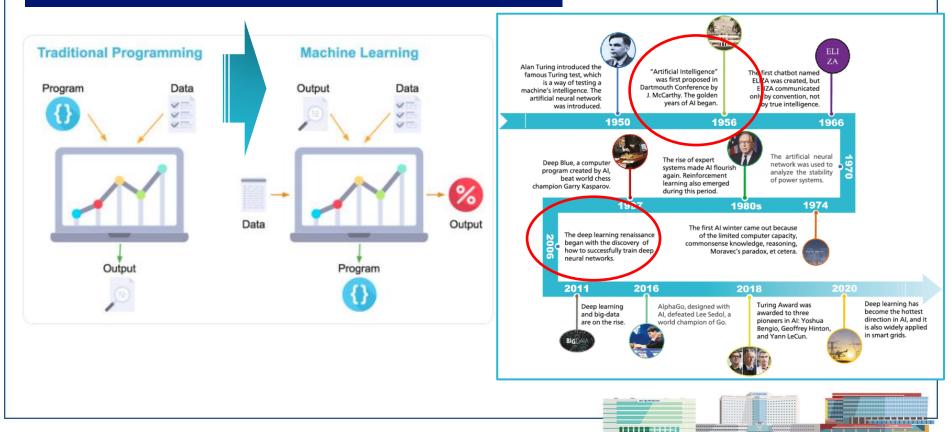


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Introduction

Software(traditional) vs. Al Software

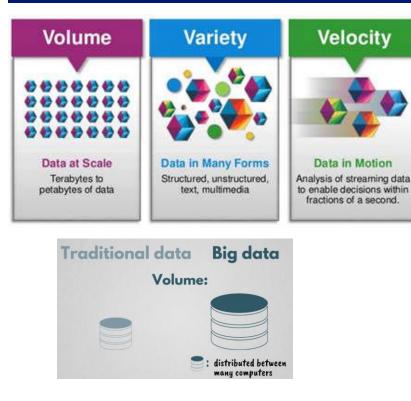


Introduction

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Traditional Data vs. Big Data

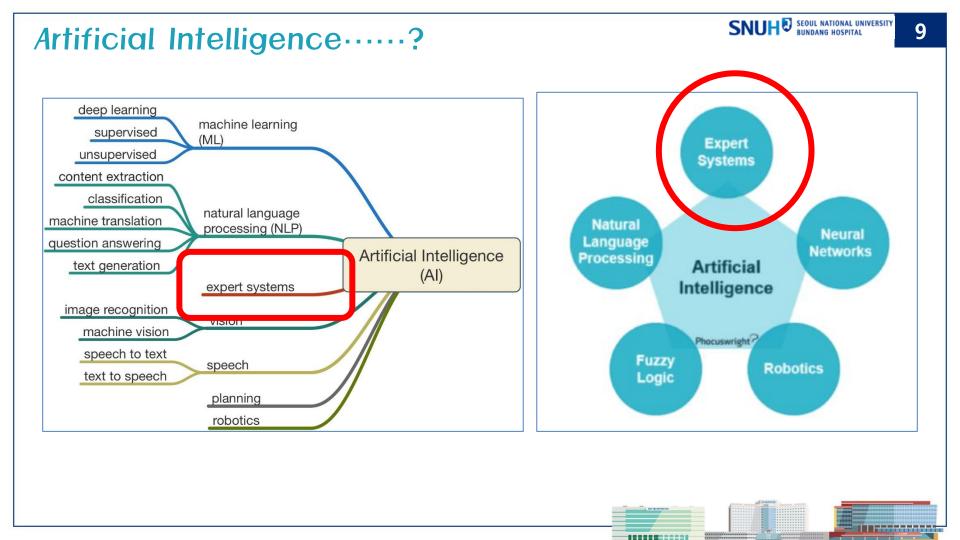


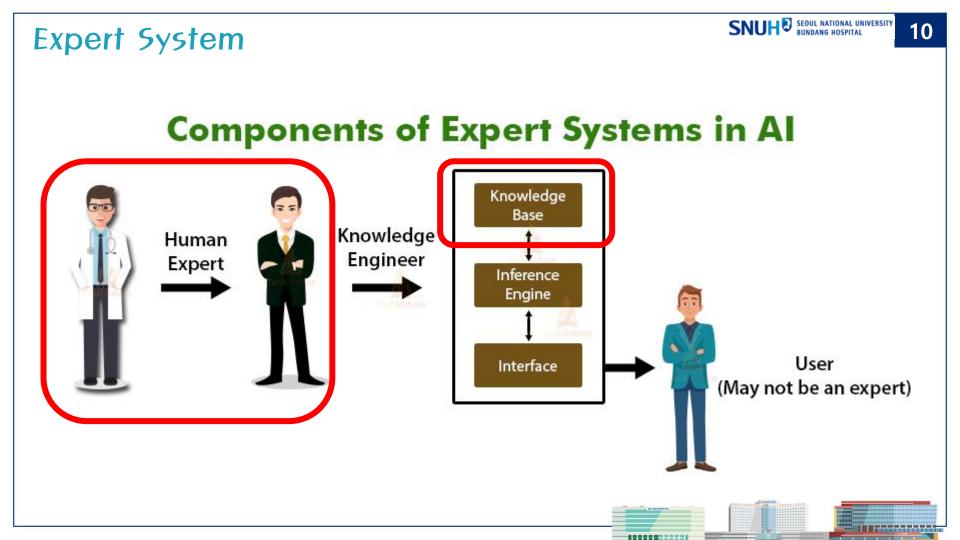


Big data and traditional analytics

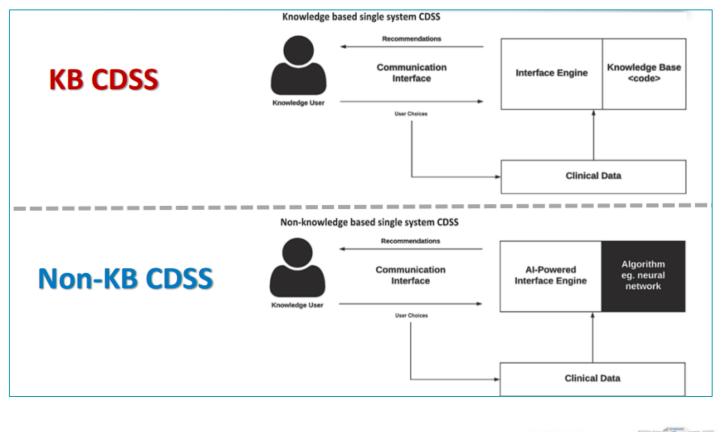
	Big data	Traditional analytics
Type of data	Unstructured formats	Formatted in rows and columns
Volume of data	100 terabytes to petabytes	Tens of terabytes or less
Flow of data	Constant flow of data	Static pool of data
Analysis methods	Machine learning	Hypothesis-based
Primary purpose	Data-based products	Internal decision support and services





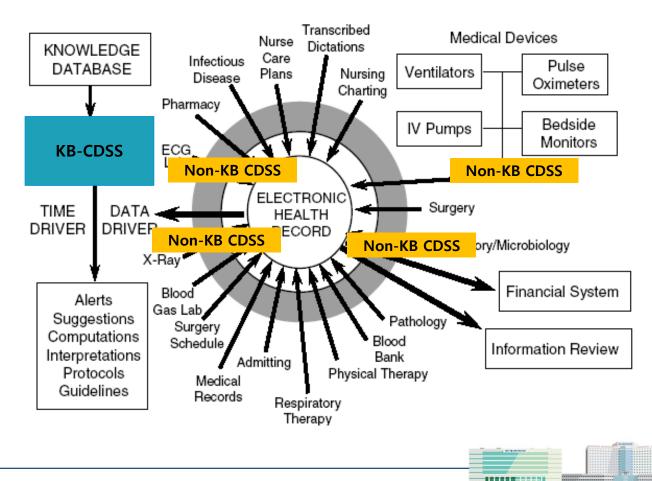


CD55(Clinical Decision Supporting System)

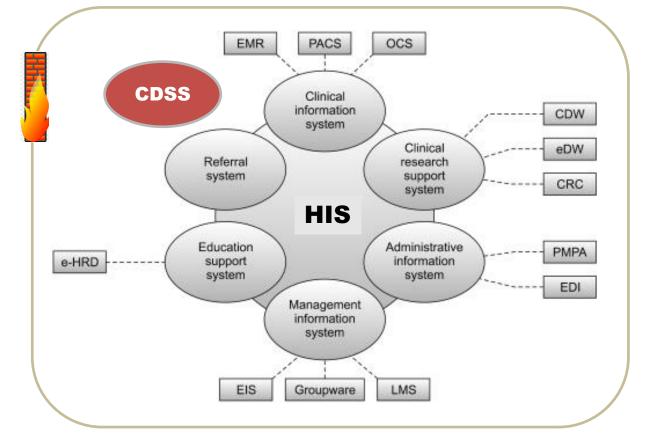




CD55(Clinical Decision Supporting System)



CD55 and HI5



CD55 and HI5



데이터 3법 '가명정보' 결합전문기관 늘린다

발행일 : 2021.07.28 18:00



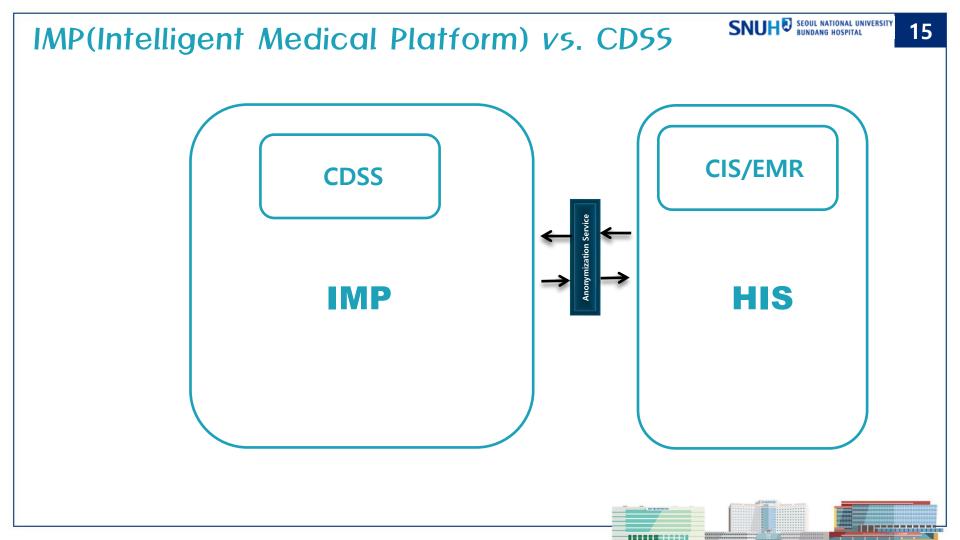
• 빚더미에 벼랑 끝 내몰린 중년층.. 이것으로 걱정 해결!

김부겸 총리, 지원센터 개소식 참석 을해 27곳으로 작년比 3배 확충 결합 기간은 기존보다 절반 단축 기관 역할도 결합 全 단계로 강화

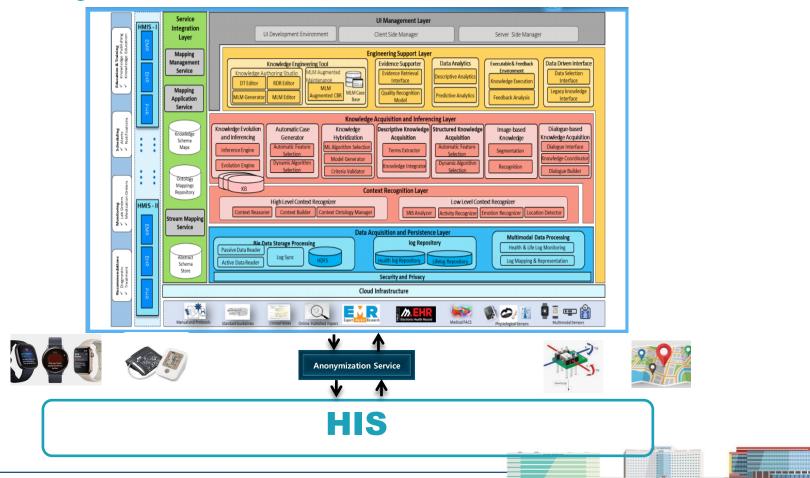




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IMP(Intelligent Medical Platform)



Al-CD55 in Hospital Setting





Heart Failure Silo in IMP

Heart Failure

심부전



Poor memory
Shortness of breath Dry cough
Chest pain Heart pounding or racing
Swollen abdomen Loss of appetite
Cold hands
Swollen lower legs
Swollen ankles

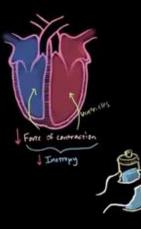
Cold feet



Heating Heart



Systolic Heart Failure



..........

Heart Failure Silo in IMP

npj Digital Medicine

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www.nature.com/npjdigitalmed

ARTICLE OPEN Artificial intelligence for the diagnosis of heart failure

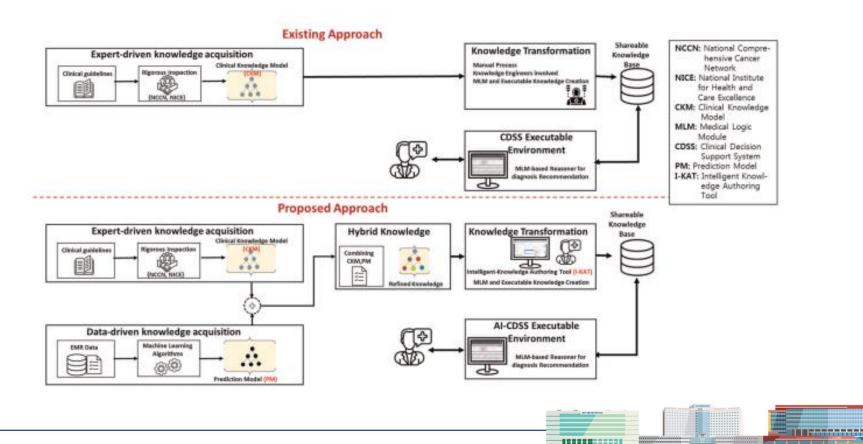
Dong-Ju Choi ^{1,3 ⊠}, Jin Joo Park ^{1,3}, Taqdir Ali² and Sungyoung Lee ²²

The diagnosis of heart failure can be difficult, even for heart failure specialists. Artificial Intelligence-Clinical Decision Support System (AI-CDSS) has the potential to assist physicians in heart failure diagnosis. The aim of this work was to evaluate the diagnostic accuracy of an AI-CDSS for heart failure. AI-CDSS for cardiology was developed with a hybrid (expert-driven and machine-learningdriven) approach of knowledge acquisition to evolve the knowledge base with heart failure diagnosis. A retrospective cohort of 1198 patients with and without heart failure was used for the development of AI-CDSS (training dataset, n = 600) and to test the performance (test dataset, n = 598). A prospective clinical pilot study of 97 patients with dyspnea was used to assess the diagnostic accuracy of AI-CDSS compared with that of non-heart failure specialists. The concordance rate between AI-CDSS and heart failure specialists was evaluated. In retrospective cohort, the concordance rate was 98.3% in the test dataset. The concordance rate for patients with heart failure with reduced ejection fraction, heart failure with mid-range ejection fraction, heart failure with preserved ejection fraction, and no heart failure was 100%, 100%, 99.6%, and 91.7%, respectively. In a prospective pilot study of 97 patients presenting with dyspnea to the outpatient clinic, 44% had heart failure. The concordance rate between AI-CDSS and heart failure specialists was 98%, whereas that between non-heart failure specialists and heart failure specialists was 76%. In conclusion, AI-CDSS showed a high diagnostic accuracy for heart failure. Therefore, AI-CDSS may be useful for the diagnosis of heart failure, especially when heart failure specialists are not available.

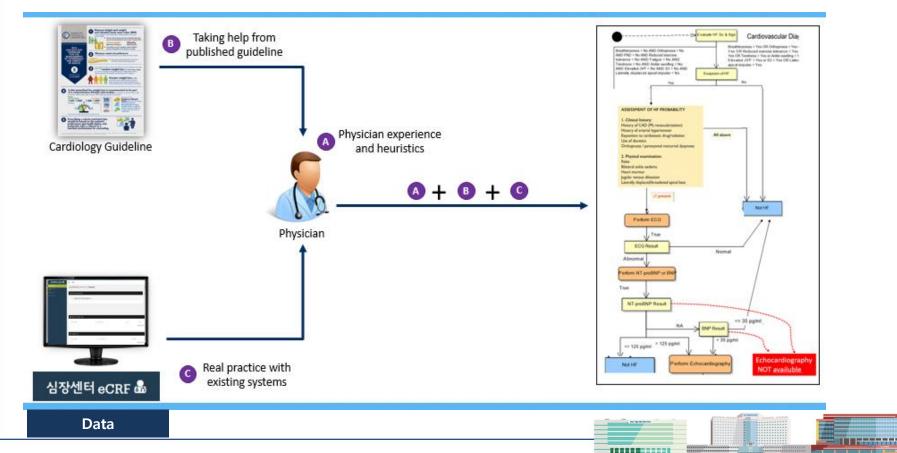
npj Digital Medicine (2020)3:54; https://doi.org/10.1038/s41746-020-0261-3



Heart Failure Silo in IMP (Hybrid Knowledge-base Expert system CDSS)



Heart Failure Silo in IMP Stage 1: Knowledge Acquisition



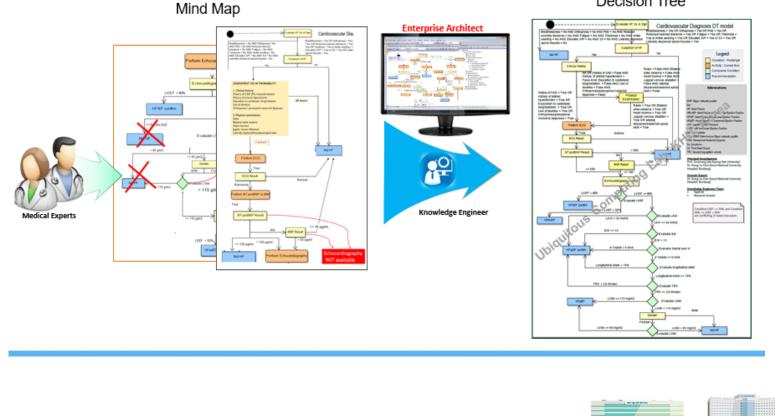
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Heart Failure Silo in IMP Stage 1: Knowledge Acquisition: 14 attributes

S. No.	Attribute Name	Attribute Description				
1	Signs & Symptoms	Patient has some sign and symptom like, breathlessness, exercise tolerance, tiredness, ankle swelling, and nocturnal cough.				
2	Clinical History	It checks the patient history such as coronary artery disease (CAD), arterial hypertension, exposition to cardio toxic drug/radiation, use of diuretics, orthopnea.				
3	Physical Examination	In this category, physicians check rales, bilateral ankle edema, heart murmur, jugular venous dilatation, laterally displaced apical beat.				
4	ECG Result	Noninvasive test to check how fast the heat beats, it may be normal or abnormal.				
5	BNP Result	B-type natriuretic peptide (BNP) blood test measures the levels of the BNP hormone in patients' blood.				
6	NT-proBNP Result	N-terminal pro-B-type natriuretic peptide level				
7	Left Ventricular Ejection Fraction (LVEF)	It finds total amount of blood in the left ventricle is pumped out with each heartbeat.				
8	Left Atrial Volume Index (LAVI)	Measure to evaluate the LA size				
9	E/e'	Measure to evaluate the diastolic function				
10	e' Septal	Measure to evaluate the diastolic function				
11	Longitudinal strain	Measure to evaluate myocardial contractility				
12	Tricuspid Regurgitation Velocity (TRV)	TRV has been shown to correlate with pulmonary artery systolic pressure (PASP) at rest (1–3) and with exercise (3–7).				
13	Left Ventricular Mass Index (LVMI)	Measure to evaluate the LV size				
14	Gender	The state of being male or female				

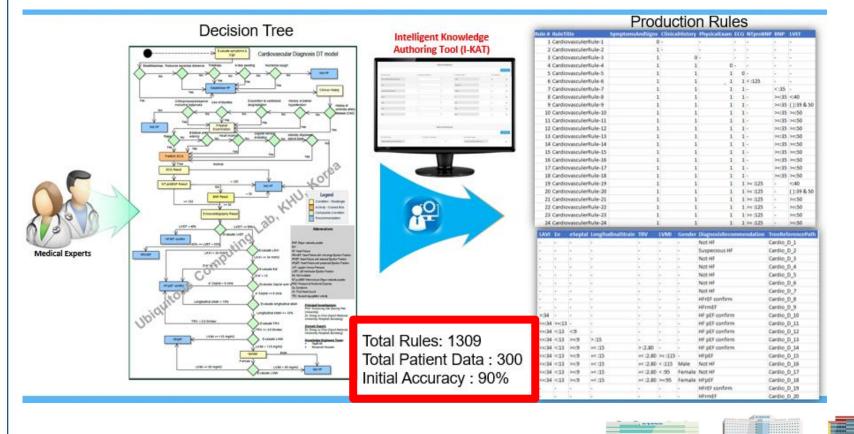


Heart Failure Silo in IMP Stage 2: Knowledge Modeling



Decision Tree

Heart Failure Silo in IMP <u>Stage 3: Knowledge Rules Creation (Expert-Driven)</u>



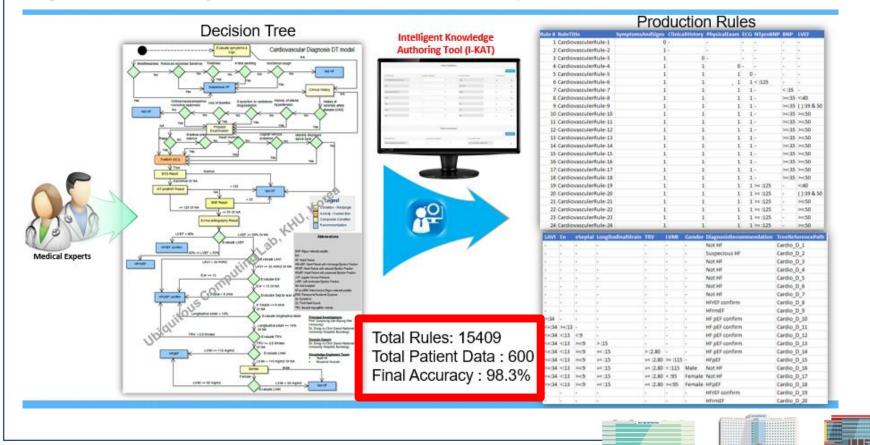
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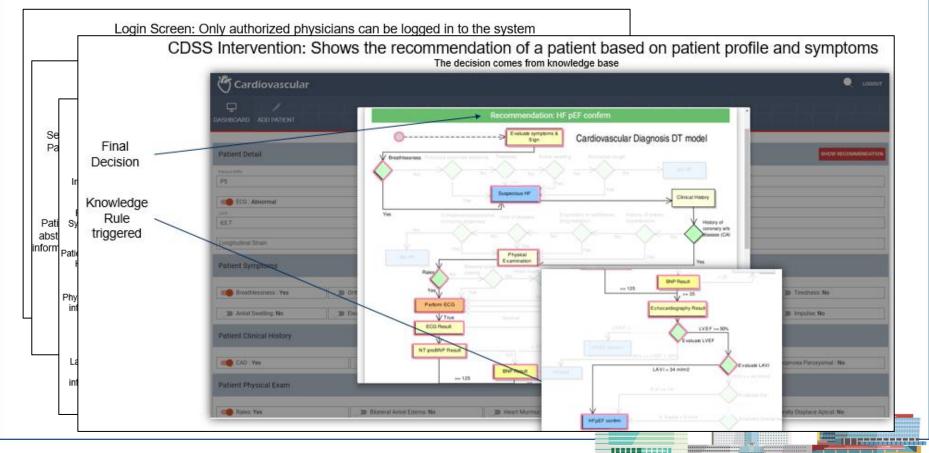
Heart Failure Silo in IMP Stage 4: 2nd Knowledge Modeling (Data-Driven)

					Р	(Heart Failure atient Data										
	ID	Age	Gender	Symptoms & Sign (If 1 or more=1, NO=0	Clinical History (If 1 or more=1, NO=0	Physical Exam (If 1 or more=1, NO=0	ECG (normal=0, abnorma=1)	NT-proBNP	BNP	LVEF	LAVI	LVMI	E/e'	e' septal	TRV	Longitudinal strain(GLS)
	10611919	79	M	1	0	0	0	185.3			37		7.38	6.1	2.5	
	11066473	63	M	1	1	0	0	209				62.01	8.31	6.74		
	11264619	41	F	0	0	0	0	327.8 185.4	-	61.54	23.67	83.4 90.96	6.1	10.82	14.5	10.3
	13401793 15072850	82	2 M	1	0	0				60.98 55		90.96 54.78	6.54 5.32	8.1 9.4		19.3
	16805356	71	M	1	0	1	1	380.2		52.94		102.4	5.89	10.7	2.5	16.6
ATET P	18411764	26	M	1	1	0	1	203.4		65.75	18.08	86.07	5.08	11.8		12
	20659893	83	F	1	1	1	0	156.2		60.56		82.15	11.25	4.8	2.6	
	26190107 26289425	78	F	1	0	0	0	201.6		56.1 55.56	31.54 33.56	83.92 67.11	10.44	4.5	2.6	18
EMR/HMIS	20289425	34	M	1	1	0	0	164.6		62.5	33.50	95.64	12.24	6.7	2.8	
	27691432	68	M	1	0	0	0	321.6		65.38		65.57	6.87	8.3	2.7	20.3
CRT	with 88	.55%				Random F	orest with 8	36%				D	ecisio	n Tree	with	82%
									1			нерет	1.917	LND -39.675 - 49.905	a)	HET
4 features out of 14					7 Teatt	res out of 14							3	featur	e out	of 14

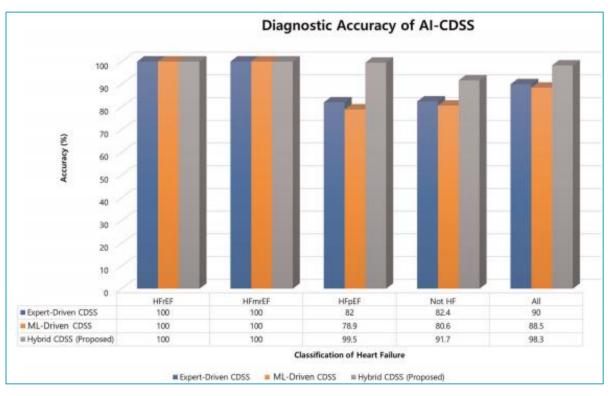
Heart Failure Silo in IMP <u>Stage 5: Knowledge Rules Creation (Data + Expert-Driven)</u>



Heart Failure Silo in IMP Stage 6: Implementation



Heart Failure Silo in IMP Validation of AI-CDSS: retrospective test set

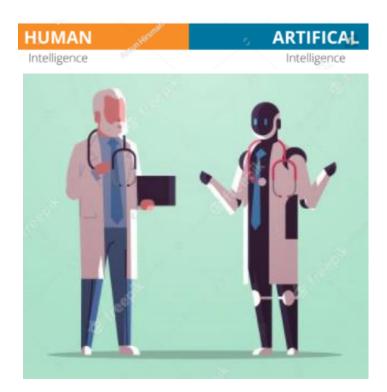




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Heart Failure Silo in IMP

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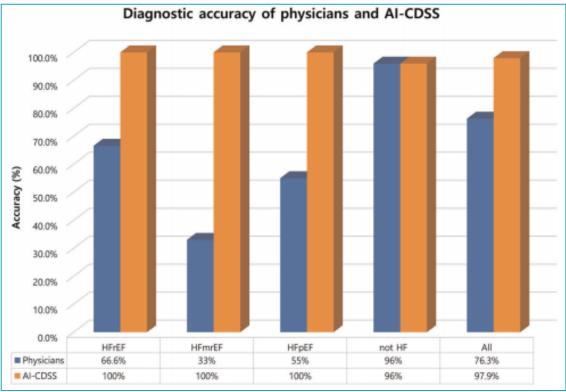
Pilot Study

연구계획서 제	심부전 진단용 인공지능 플랫폼의 유용성에 대한 연구
목	(Clinical application of Artificial Intelligence Platform for the Diagnosis of
	Heart Failure)
연구목적	호흡곤란이 주소인 환자에서 심부전 진단에 대한 인공지능 플랫폼의 유용
	성 평가를 하고자 함.
연구 설계	A prospective, single arm, single-center, pilot study
연구 예상 기간	12 개월
연구대상자수	전체 100명
연구대상	호흡곤란 환자
시험 약	해당 사항 없음
용법 및 용량	해당 사항 없음
주요 선정기준	1. 만 19 세 이상,80세 미만의 남•녀
	2. 호흡곤란을 주소로 외래를 방문한 환자
	3. 첫 번째 방문에서 심전도,NT-proBNP(orBNP) 및 심초음파를 시행한
	환자
	4. 본 임상연구에 참여할 것을 자발적으로 서면 동의한 자
주요 선정 제외	1. 중증의 호흡곤란으로 입원치료가 필요한 환자
기준	2. 의사소통이 어려운 환자
목표대상자수	100명
산정	
유효성 평가 기	1. 일차 연구목표:
준	Diagnostic accuracy of clinical decision support system (CDSS) to
	diagnose heart failure.
	2. 이차 연구목표
	CDSS의 진단 정확도에 영향을 미치는 요소

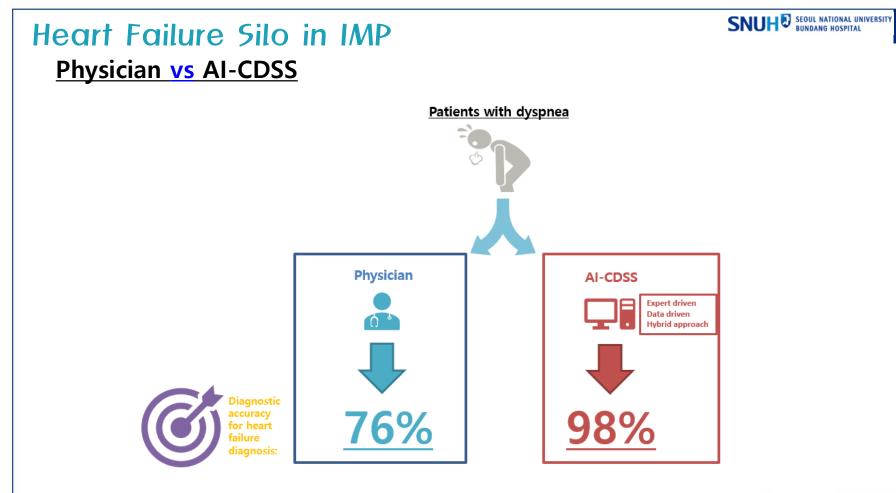


Heart Failure Silo in IMP

Physician vs AI-CDSS



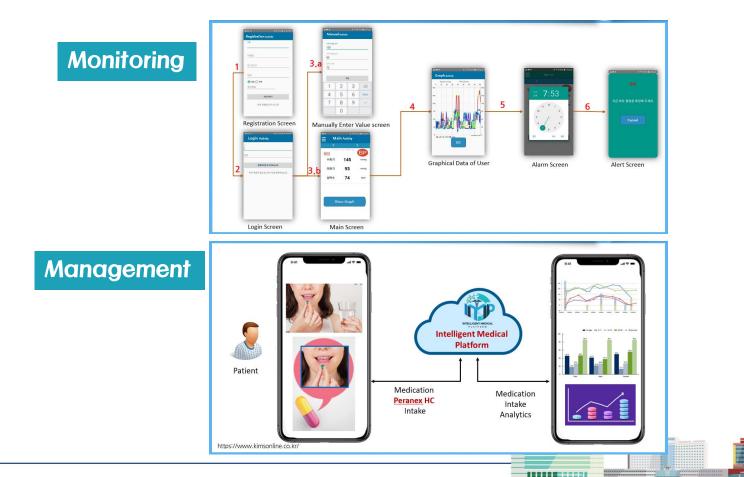
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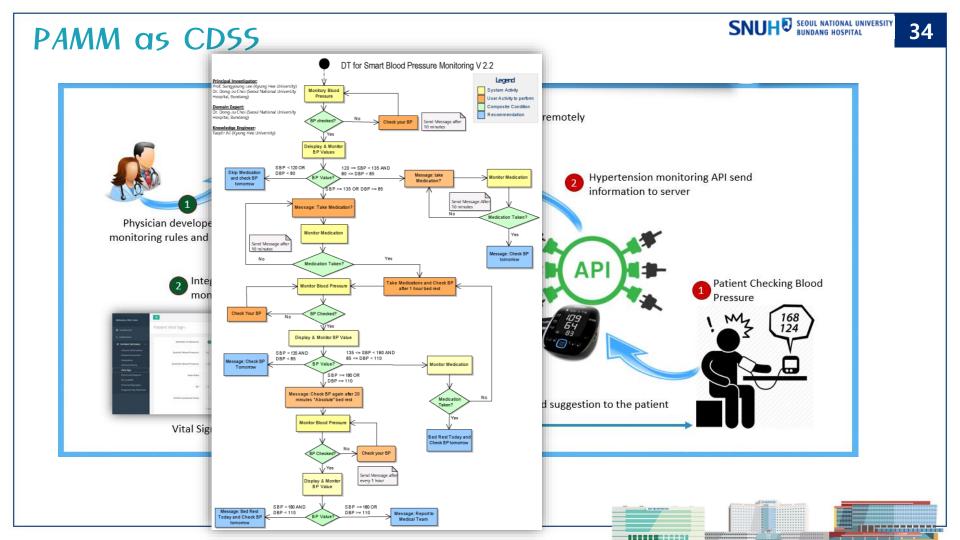




AI-CD55 in Home Care Setting

AI-Patient Monitoring and Management App.(AI-PAMM)

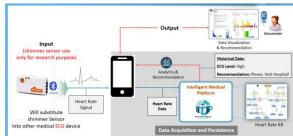




PAMM monitoring

Blood Pressure



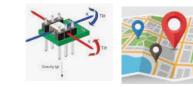


ECG









그 외의 접속 가능한 wearable devices..... PPG, Impedance, Bwt...



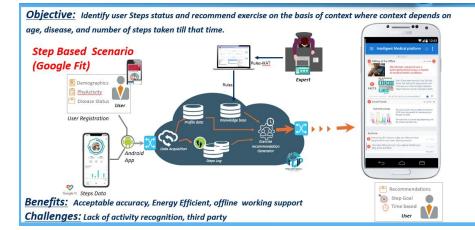


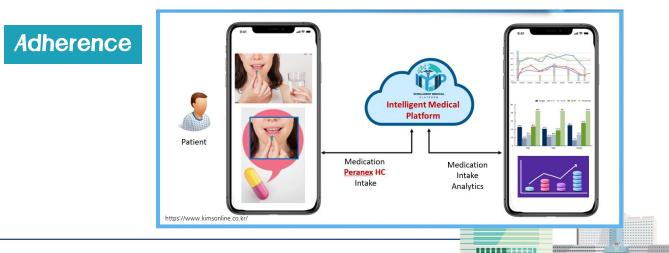
Behavior



PAMM management

Behavior





PAMM 임상연구

분당서울대학교병원 생명윤리심의위원회									
Tel: 82-31-787-8801~8805 Fax: 82-31-787-8869 경기도 성남시 분당구 구미로 173번길 82 (무) 13620									
HRPP SOP ver3.2_2018.06.01/e-IRB(rev) 2018.09.20 심의결과통보서									
IRB No.	B-1904/53								
연구 과제명	(국문)	자가인식 앱 피드백 시스템을 통한 edoxaban 약물 순응도 향상 연구: 무작위대조군연구							
	(영문)	(영문) Self-awareness of drug adherence to edoxaban using an automatic app. feedback system: a randomized controlled study							
	Protocol No.	Adher	e_App	Version No.	2.0				

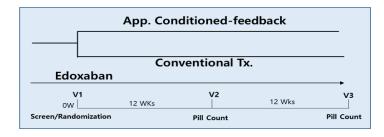
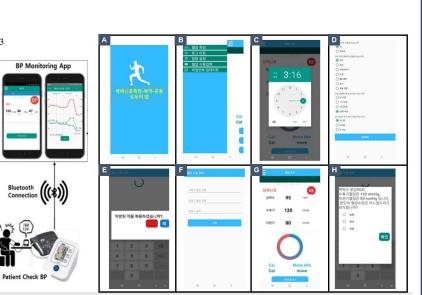


Figure 3



BP & HR

Measurement

Atrial

Fibrillation

+ NOAC (Edoxaban)

for stroke

prevention

Expected

Outcome

Improve NOAC Adherence

Improve

Clinical

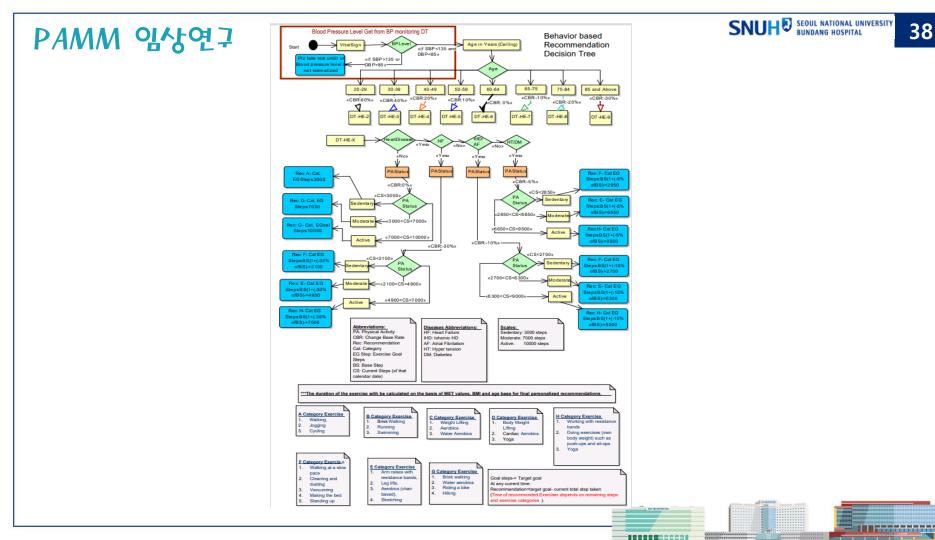
Composite End Point

TIH

Smartphone

based feedback

2 69 -



PAMM 임상연구

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BMJ Open - Manuscript ID bmjopen-2021-048777.R1 발은편지함 ×

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COVID-19: A message from BMJ: https://authors.bmj.com/policies/covid-19

26-Jul-2021

Dear Dr. Kim:

Your manuscript entitled "Rationale, Design, and Efficacy of a Smartphone Application for Improving Self-Awareness of Adherence to Edoxaban Treatment: A Randomized Controlled Study (Adhere App)" being given full consideration for publication in BMJ Open.

Your manuscript ID is bmjopen-2021-048777.R1.

Please mention the above manuscript ID in all future correspondence or when calling the office for questions. If there are any changes in your street address or e-mail address, please log in to ScholarOne on <u>ibmjopen</u> and edit your user information as appropriate.

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Any individuals listed as co-authors on this manuscript are copied into this submission confirmation email. If you believe that you have received this email in error, please contact the Editorial Office.

Rationale, Design, and Efficacy of a Smartphone Application for Improving Self-Awareness of Adherence to <u>Edoxaban</u> Treatment: A Randomized Controlled Study (Adhere App)[&]

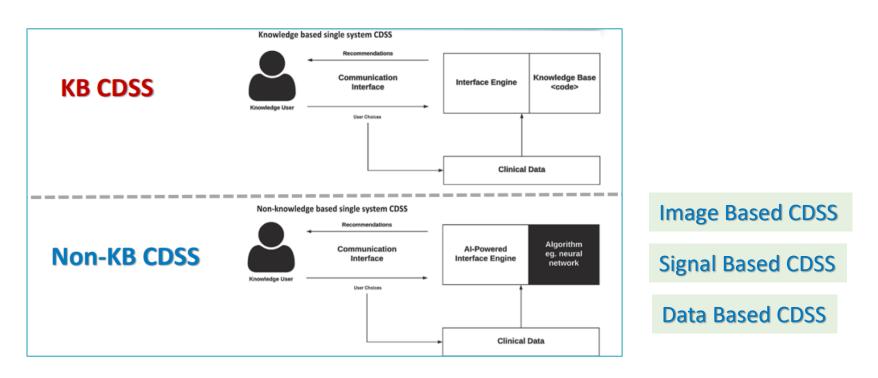
In-Cheol Kim¹, Ji-Hyun Lee², Dong-Ju Choi², Sung-Ji Park³, Ju-Hee Lee⁴, Sang Min Park⁵,

Mina Kim⁶, Hack-Lyoung Kim⁷, Sunki Lee⁸, In-Jae Kim⁹, Seounghoon Choi¹⁰, Jaehun Bang¹¹,

Bilal Ali¹¹, Musarrat Hussain¹¹, Taqdir Ali¹¹, and Sungyoung Lee¹¹

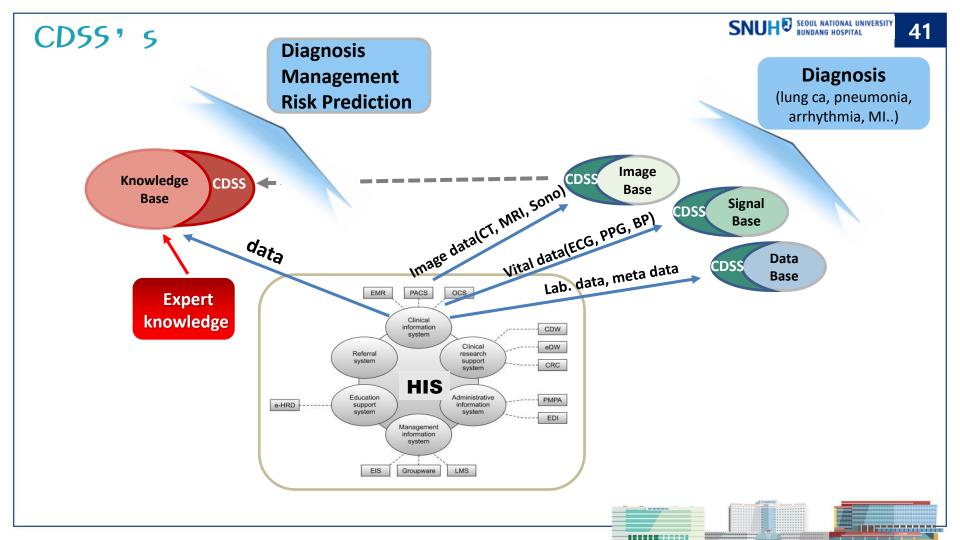


CD55(Clinical Decision Supporting System)





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Massages

- 1. AI-CDSS may be useful for the diagnosis of HF, especially when HF specialists are not available in hospital setting.
- 2. AI-CDSS may be also useful for the monitoring and managements of chronic disease in usual life setting.
- 3. It is necessary to devise ways in which many kinds of AI-CDSS and SaMD can be used complementary to or fused with each other.
- 4. Methods that can smoothly link HIS and CDSS is essential.

