

# Effectiveness of AI Solution to Analyze CT for Screening Patients with Emergent Large Vessel Occlusion

Non-contrast CT based AI solution for LVO triage and notification

Dong Hoon Shin, MD, Ph.D CEO of Heuron Co., Ltd.

Brain New Life, Together.

## Brain New Life, Together



We lead in high-barrier neuroscience diagnostics, dedicated to rapidly diagnosing brain diseases through AI technology to uphold the dignity of patients and society.

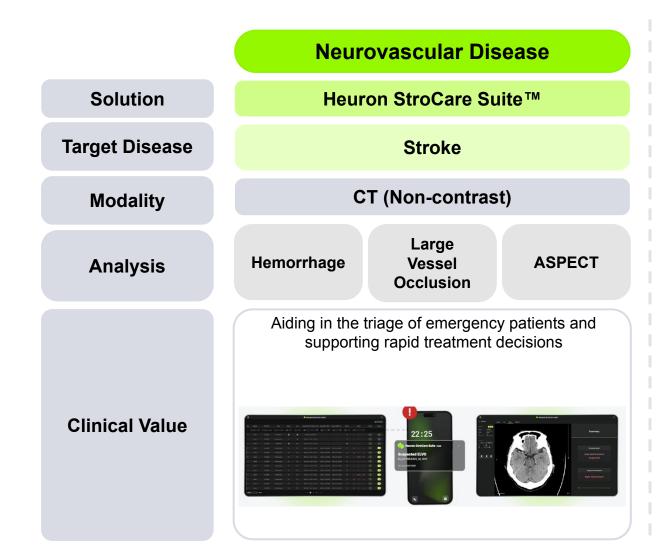


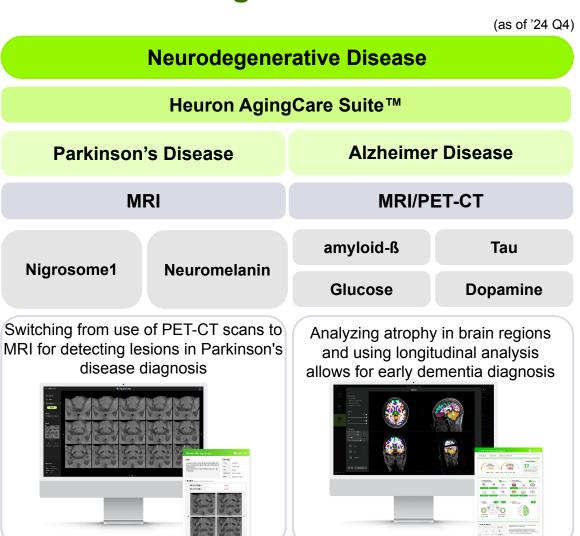


#### Heuron's Solution

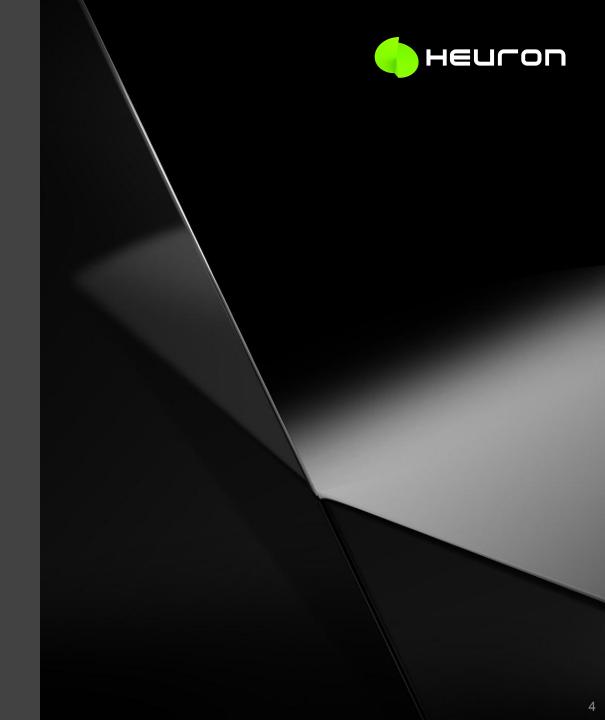


Heuron's solution reduces barriers to healthcare, addressing everything from acute brain disorders to degenerative neurological conditions.





# Heuron SCS<sup>TM</sup>



## Why stroke?



#### The problem at hand

### Once lost, recovering the brain is incredibly challenging

6.3 hours

The average time consumption from the first abnormal symptom detection to a hospital arrival in South Korea

2nd lethal

Leading cause of death, 6.6 million died globally in 2019 160<sup>M</sup> DALYs

The sum of years lost due to premature death and years lived with disability in 2021 worldwide

101<sub>M</sub> aftermath

The number of people living with the stroke aftermath in global

## Every second counts!!

#### Stroke in Slovakia



12,675

Incidence

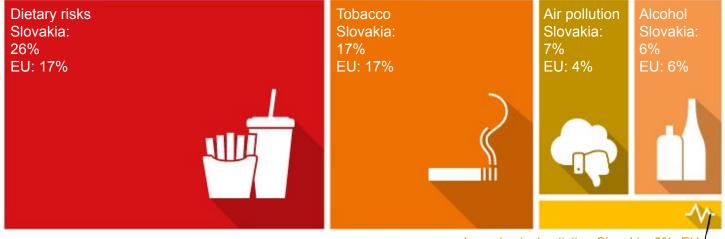
In 2021

106,246

Prevalence

In 2021

#### Risk factors and mortality rates of Slovakia and EU average



Low physical activity - Slovakia: 2% EU:

Estimated increase 2015-2035



Incidence 53%



Prevalence 36%



Dealths 77%



DALYs Lost 52%

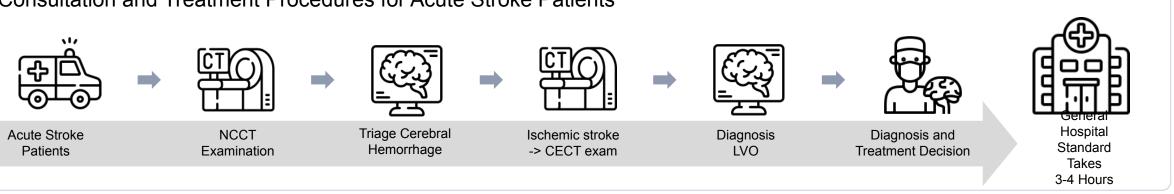
Source: 1) Institute for Health Metrics and Evaluation GBD 2021 2) The Burden of Stroke in Europe report conducted by King's College London for the Stroke Alliance for Europe

#### Time is Brain

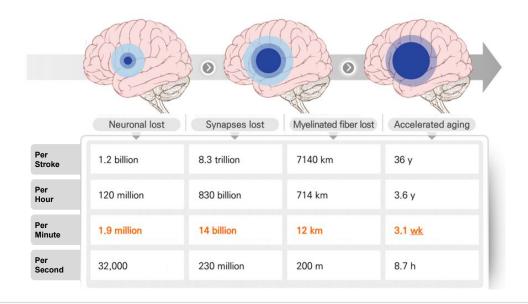
Stroke Treatment 'Golden Hour'

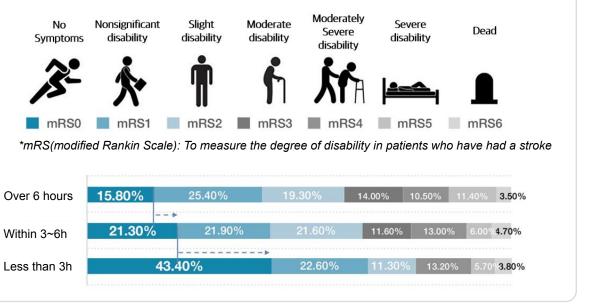


#### Consultation and Treatment Procedures for Acute Stroke Patients



#### Brain Damage and Prognosis According to the Time Elapsed After Acute Stroke Onset

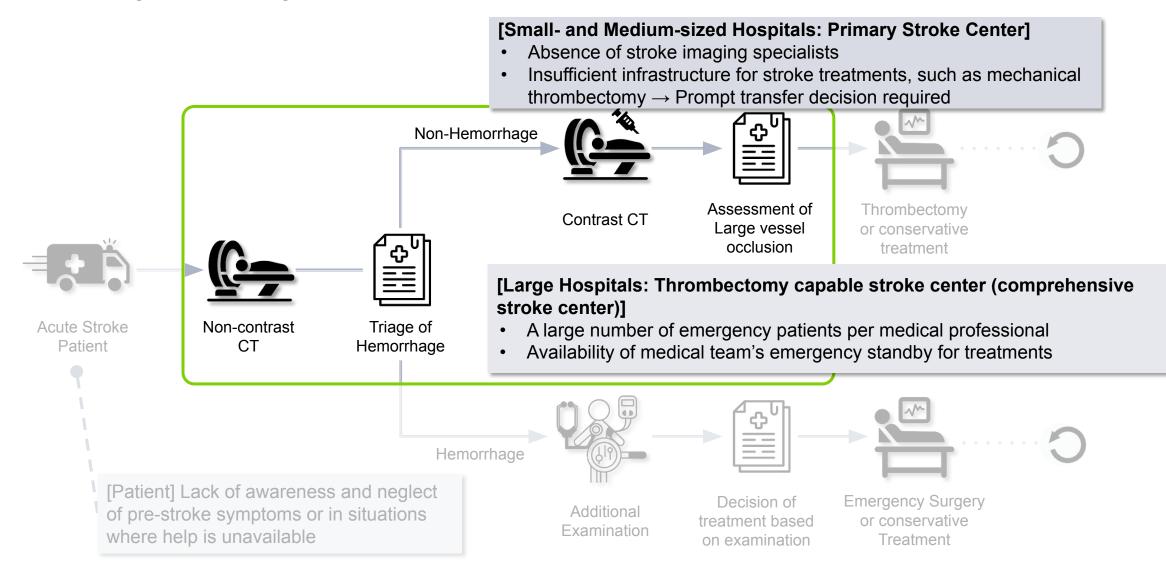




## Key Time-Consuming Challenges in Stroke Centers



Solutions for Reducing Time-Consuming Points



## Heuron StroCare Suite<sup>TM</sup>

Rapid Notification for Stroke Patient Treatment





**Heuron ICH** 

**Heuron ELVO** 

**Heuron ASPECTS** 

FDA 510(k) cleared

### Heuron StroCare Suite<sup>TM</sup>

MMS/어플리케이션을 통한 응급 환자 분석 결과 및 알람 시스템



#### **Notification**

Get immediate notifies on critical findings



#### Worklist

Can access real-time worklist & patient transfer in/out tagging



#### **Viewer**

Can easily switch original and result images in the viewer



#### Share/Save/Message

Can share or save images & closed network message function









#### Heuron ICH

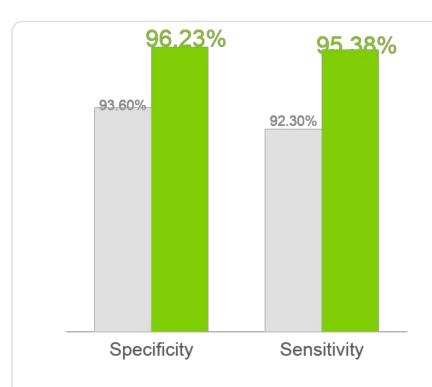


Training Dataset & Clinical Trial for MFDS clearance

	Training Data-set		
	Total	Positive cases of hemorrhage	Negative cases of hemorrhage
Patient-wise	21,816	8,920	12,896
Slice-wise	749,590	107,454	642,136

Clinical Test Data-set (patient-wise)				
Total	Positive cases of hemorrhage	Negative cases of hemorrhage		
236	106	130		

- Study design: Open Label, Single-center, Retrospective, Pivotal Trial
- Reference Standard:
   Two neurologists reviewed blinded brain CT images and established a reference standard based on the hemorrhagic stroke diagnostic criteria
  - Presence of hemorrhagic stroke
     Subtypes of hemorrhagic stroke, if diagnosed with (intracerebral,
     intraventricular, subarachnoid, epidural, subdural)
     The number of CT slices where hemorrhage is confirmed, if diagnosed with



Primary Endpoint:Heuron ICH: Sensitivity & Specificity

- PPV: 94.4%

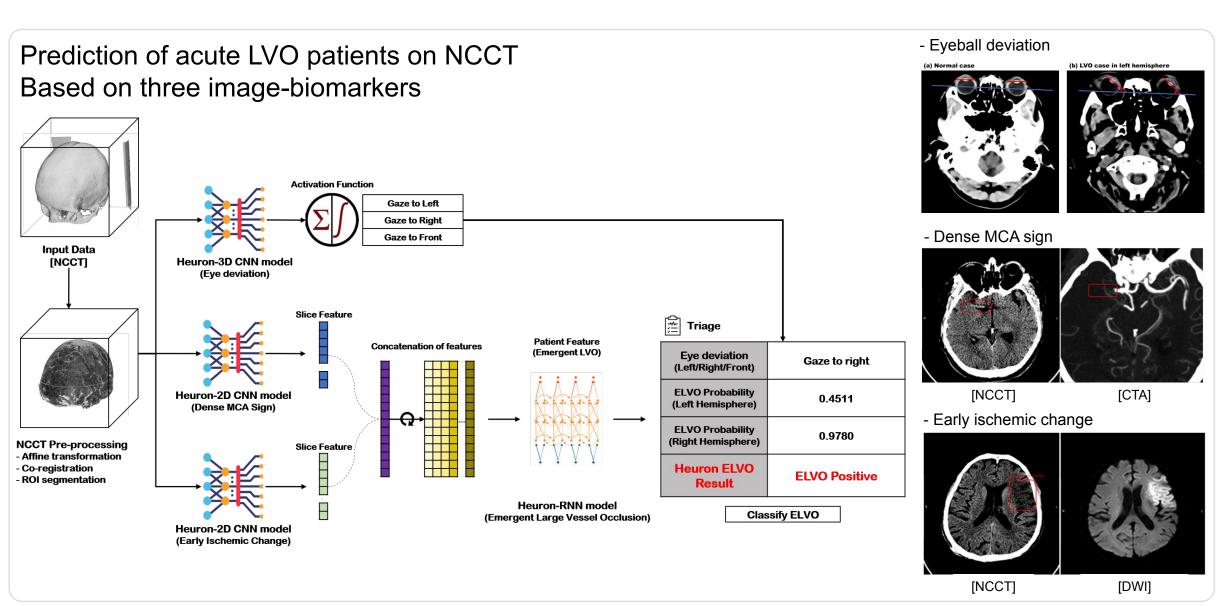
- NPV: 96.87%

- Accuracy : 95.76%

#### **Heuron ELVO**

LVO prediction model structure





#### Heuron ELVO

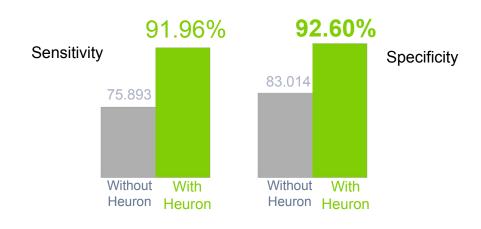




#### Clinical Trial for MFDS clearance – A Pivotal clinical trial in single center

Clinical Data-set (Patient-wise)					
Total	Positive cases of LVO*	Negative cases of LVO			
477	112	365			

- ☐ Study design: Open Label, Single-center, Retrospective, Pivotal Trial
- ☐ Total 477 cases (Positive ELVO cases: 112, Negative cases: 365)
- ☐ Reference standard: Two stroke experts provided reference standard using medical records with diagnosed code
- ☐ Primary Endpoint: Statistical difference in sensitivity and specificity when only visual interpretation of non-contrast CT and when referring to AI analysis results



	Sensitivity %	Sensitivity % Specificity %	
ELVO classification	(TP/TP+FN) [95% CI]	(TN/TN+FP) [95% CI]	AUROC [95% CI]
Standalone	88.4 (99/112) [81.0–93.7]	91.2 (333/365) [87.9–93.9]	0.93 [0.90-0.96]

	Sen	sitivity (TP/TP-	FN)	S	pecificity (TN/TN	+FP)		AUROC	
Consensus lev	el analysis								
	Unassisted stage	AI-assisted stage	p value	Unassisted stage	AI-assisted stage	p value	Unassisted stage	AI-assisted stage	p value
0/ 1050/ CH		92.0 (103/112),		83.0 (303/365),	92.6 (338/365),		0.87,†	0.95,†	0.04
%, [95% CI]	[66.9–83.7]	[85.3–96.3]	0.0009	[78.8–86.7]	[89.4–95.1]	<0.0001	[0.83-0.90]	[0.92-0.97]	0.04
ndividual lev	el analysis %,	[95% CI]							
Reader 1	68.8 (77/112),	90.2 (101/112),	<0.0001	85.5 (312/365),	92.1 (336/365),	0.002	0.84,†	0.96,†	0.02
Keauer 1	[59.3–77.2]	[83.1–95.0]	<0.0001	[81.4–88.9]	[88.8–94.6]	0.002	[0.79-0.88]	[0.94-0.98]	
B 1 4	58.0 (65/112),	81.3 (91/112),	//	89.86 (328/365),	93.97 (343/365),	0.04	0.83,†	0.95,†	0.02
Reader 2	[48.3–67.3]	[72.8-88.0]	<0.0001	[86.3–92.8]	[91.0–96.2]		[0.78-0.87]	[0.92-0.97]	
	85.7 (96/112),	79.5 (89/112),	0.24	46.6 (170/365),	92.9 (339/365),		0.82,†	0.91,†	0.11
Reader 3	[77.8–91.6]	[70.8–86.5]	0.26	[41.4–51.8]	[89.7–95.3]	<0.0001	[0.78-0.86]	[0.86-0.94]	
	57.1 (64/112),	74.1 (83/112),	0.0000	66.9 (244/365),	90.7 (331/365),		0.78,†	0.92,†	0.02
Reader 4	[47.5–66.5]	[65.0-81.9]	0.0009	[61.8–71.7]	[87.2–93.5]	< 0.0001	[0.73-0.83]	[0.88-0.94]	
nterrater reli	ability of agree	ement							
Fleiss' k	appa		Unassis	ted stage			AI-assisted	stage	
к [95%	CI]		0.27 [0.	26-0.28]			0.75 [0.74-	-0.76]	

#### Performance of ASPECTS scoring system in ER

HEUCON

J NeuroIntervent Surg

#### **Objective**

To develop and validate an automated ASPECTS scoring system using deep learning algorithm.

#### Validation dataset

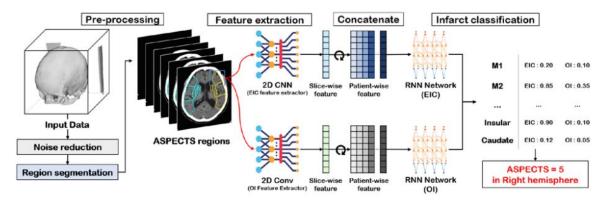
- Randomized data selection was performed in patients aged ≥19 years with thrombolysis code activation in ER
- final diagnosis of AIS was confirmed using diffusion-weighted MRI
- NCCT slice thickness varied from 3 to 5 mm



#### ASPECTS reference standard with NCCT

2 experts with ≥ 10 years of clinical experience

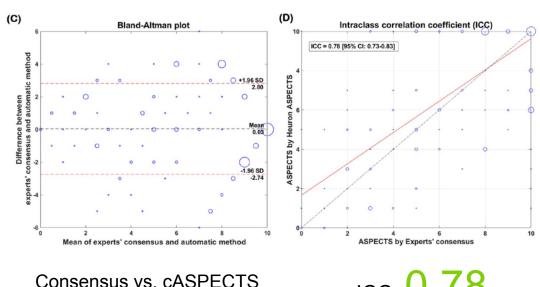
(if the results were different, it determined by consensus between the 2 experts)



#### In conclusion,

Heuron ASPECTS effectively measured ASPECTS in patients with suspected ischemic stroke on NCCT scans and suggesting the potential usefulness of DL algorithm software in aiding physicians in stroke patient care.

#### Performance of Heuron ASPECTS, which was the degree of agreement with the reference standard



Consensus vs. cASPECTS

Mean diff. < 0.35 = 0.032

Good-to-Excellent Agreement

#### Heuron SCS





#### External Validation – more than 6 institutions (4 different vendors' CT scanner included)

Validation data-set (I	Patient-wise)		
Total	Positive cases of ICH	Positive cases of LVO*	Negative cases of ICH or LVO*
2,808	973	502	1,333

<sup>\*</sup>Proximal anterior circulation only – ICA to MCA-M1/M2 bifurcation

#### Heuron ICH performance

# ICH positive 925 19 ICH negative Prediction 48 1,816

#### Heuron ELVO performance

	GT-LVO positive	GT-LVO negative
LVO positive Prediction	411	137
LVO negative Prediction	93	2,167

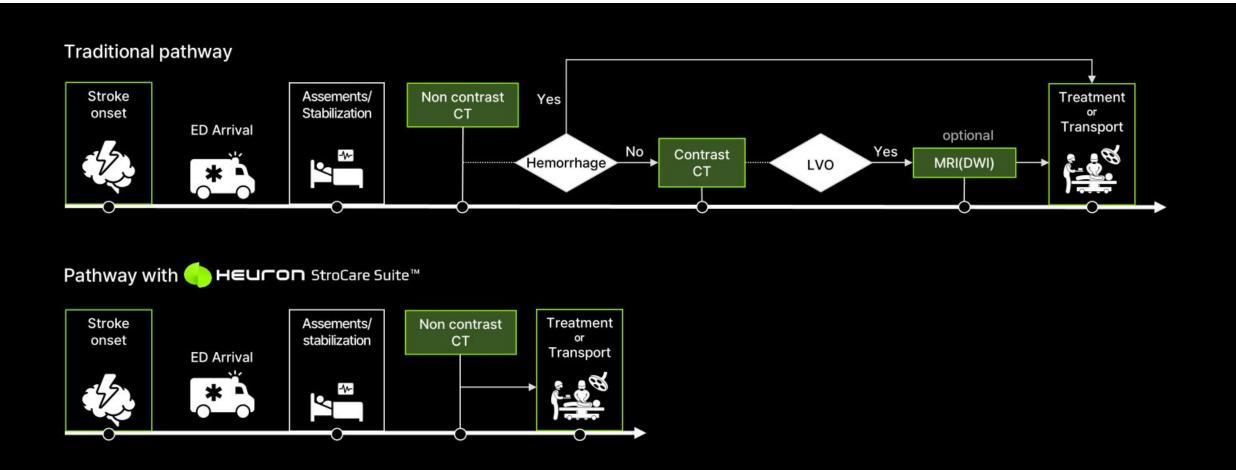
- Sensitivity: 95.07% [95% CI: 93.51 to 96.34%]
- Specificity: 98.96% [95% CI: 98.39 to 99.38%]
- □ Positive prediction value: 97.99% [95% CI: 96.89 to 98.70%]
- □ Negative prediction value: 97.42% [95% CI: 96.63 to 98.03%]
- □ Accuracy: 97.61% [95% CI: 96.98 to 98.15%]

- ☐ Sensitivity: 81.55% [95% CI: 77.88 to 84.84%]
- ☐ Specificity: 94.05% [95% CI: 93.01 to 94.98%]
- □ Positive prediction value: 75.00% [95% CI: 71.73 to 78.01%]
- □ Negative prediction value: 95.88% [95% CI: 95.10 to 96.55%]
- Accuracy: 91.81% [95% CI: 90.73 to 92.80%]

## Heuron StroCare Suite™: Faster triage, prompt actions



#### Reduce treatment initiation time with shorter process



## Heuron StroCare Suite<sup>TM</sup>: Proven and market ready



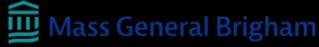


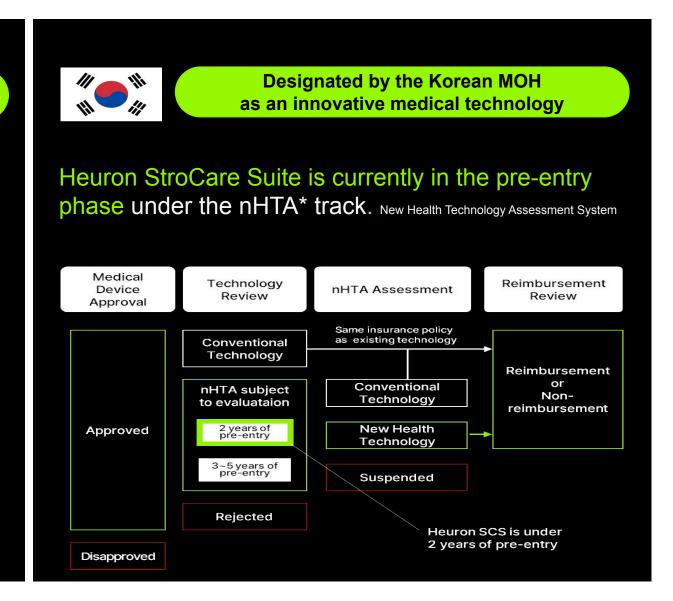
First FDA-Approved Korean Al solution for triage and notification

#### Heuron ICH – FDA 510(K) Cleared

Detects and triages suspected hemorrhages to prioritize emergency patients.



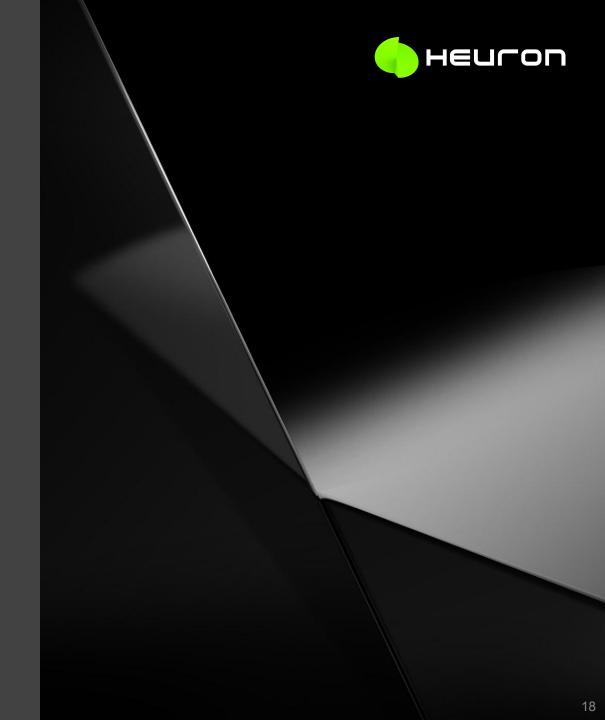




03

## Clinical Application

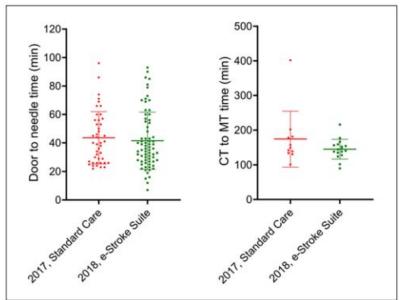
Real-World Evidence

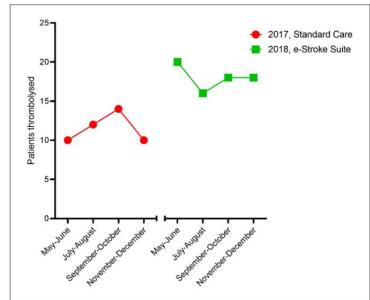


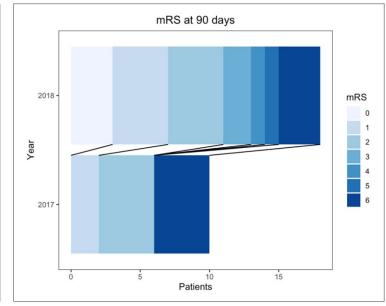
## Previous publication in LVO triage based on AI solution



Cerebrovasc Dis Extra, 2022 – Brainomix e-Stroke Suite (CTA)







**Fig. 1.** Treatment times for patients in consecutive years for thrombolysis (left) and MT (right).

**Fig. 2.** Thrombolysis treatment rates over 2-month periods during 2017 and 2018.

Fig. 3. mRS distributions at 90 days following stroke in the MT cohort.

- Data was collected for 7 months in 2017 and 2018 to compare the effects before and after utilizing AI solutions.
- CT-to-groin puncture time decreased by 16% from 174±80.5 minutes in 2017 to 145±28 minutes in 2018.
- The number of cases in which mechanical thrombectomy was performed increased from 11 cases in 2017 to 19 cases in 2018.
- The number of patients with an mRS score (at 90 days) of '0' increased from 2 (18%) cases in 2017 to 7 (37%) cases in 2018.

## Previous publication in LVO triage based on AI solution



**|** HEUCOI

JAMA Neurology | Original Investigation

## Automated Large Vessel Occlusion Detection Software and Thrombectomy Treatment Times

A Cluster Randomized Clinical Trial

JAMA Neurology, 2023 - Viz.ai CTA

Juan Carlos Martinez-Gutierrez, MD; Youngran Kim, PhD; Sergio Salazar-Marioni, MD; Muhammad Bilal Tariq, MD; Rania Abdelkhaleq, MPH; Arash Niktabe, DO; Anjan N. Ballekere, MS; Ananya S. Iyyangar, BS; Mai Le, BS; Hussain Azeem, BS; Charles C. Miller, PhD; Jon E. Tyson, MD, MPH; Sandi Shaw, RN; Peri Smith, RN; Mallory Cowan, RN; Isabel Gonzales, RN; Louise D. McCullough, MD, PhD; Andrew D. Barreto, MD; Luca Giancardo, PhD; Sunil A. Sheth, MD

Table 1	. Patient	Demogra	phics

Characteristic	Total cohort (n = 243), No. (%)	Pre-Al (n = 140), No. (%)	Post-Al (n = 103), No. (%)	P value
Age, y, median (IQR)	70 (58-79)	69.5 (58.5-78)	71 (57-79)	.68
Sex				
Female	122 (50)	73 (52)	49 (48)	40
Male	121 (50)	67 (48)	54 (52)	48
Last known well to hospital arrival, min, median (IQR)	132 (61-498)	131.5 (61-472)	147 (65-569)	.60
NIHSS score	17 (11-22)	17 (11-23)	16 (11-21)	.19
RACE score ≥5	187 (77)	110 (79)	77 (75)	.49
CT ASPECTS	9 (7-10)	9 (7-10)	10 (8-10)	.04
IV tPA	111 (46)	63 (45)	48 (47)	.80
Occlusion location				
Internal carotid artery	42 (17)	29 (21)	13 (13)	
M1 middle cerebral artery	111 (46)	56 (40)	55 (53)	
M2 middle cerebral artery	51 (21)	29 (21)	22 (21)	-
Basilar artery	11 (5)	9 (6)	2 (2)	
Cervical internal carotid artery and tandem intracranial	9 (4)	4 (3)	5 (5)	.11
Posterior cerebral artery	5 (2)	2 (1)	3 (3)	
Vertebral artery	3 (1)	3 (2)	0 (0)	
Other	11 (5)	8 (6)	3 (3)	

Characteristic	Total cohort (n = 243), No. (%)	Pre-Al (n = 140), No. (%)	Post-Al (n = 103), No. (%)	P value
DTG time, min (IQR)	97 (75-113)	100 (81-116)	88 (65-110)	.002
Hospital arrival to IV tPA bolus time, min (IQR)	30 (21-41)	30 (22-44)	28 (21-36)	.14
Initiation of CT scan to EVT start time, min (IQR)	80 (60-96)	85 (68-99)	72 (55-90)	<.001
Length of stay, d (IQR)	7 (4-11)	7 (4-12)	6 (3-10)	.11
TICI 2b/3 reperfusion	219 (90)	124 (89)	95 (92)	.34
Safety outcomes				
Symptomatic ICH	9 (4)	7 (5)	2 (2)	.21
Any ICH	43 (18)	24 (17)	19 (18)	.81

44 (31)

13 (13)

Abbreviations: AI, artificial intelligence; CT, computed tomography; DTG, door to groin; EVT, endovascular stroke therapy; ICH, intracerebral hemorrhage; IV tPA, intravenous tissue plasminogen activator; TICI, thrombolysis in cerebral infarction.

#### Table 3. Mixed-Model Stepped-Wedge Outcomes<sup>a</sup>

Mortality

Characteristic	Coefficient (95% CI)	P value
Primary outcome		
DTG time, min	-11.2 (-18.22 to -4.2)	<.01
Secondary outcomes		
Initiation of CT scan to EVT start time, min	-9.8 (-16.9 to -2.6)	<.01
Hospital arrival to IV tPA bolus time, min	-3.5 (-9.1 to 2.2)	.23
Length of stay, d	-0.4 (-2.6 to 1.7)	.72

57 (23)

Abbrevations: CT, computed tomography; DTG, door to groin; EVT, endovascular stroke therapy; IV tPA, intravenous tissue plasminogen activator.

#### Significantly reduced metrics

- Door-to-groin (DTG) time: 11.2 mins↓
- CT-to-EVT time: 9.8 mins ↓

<.001

☐ Ratio of mortality reduced significantly

<sup>&</sup>lt;sup>a</sup> Regressions adjusted for age, sex, and National Institutes of Health Stroke Scale score.

#### Reduction Treatment Time for Stroke Patients in ER



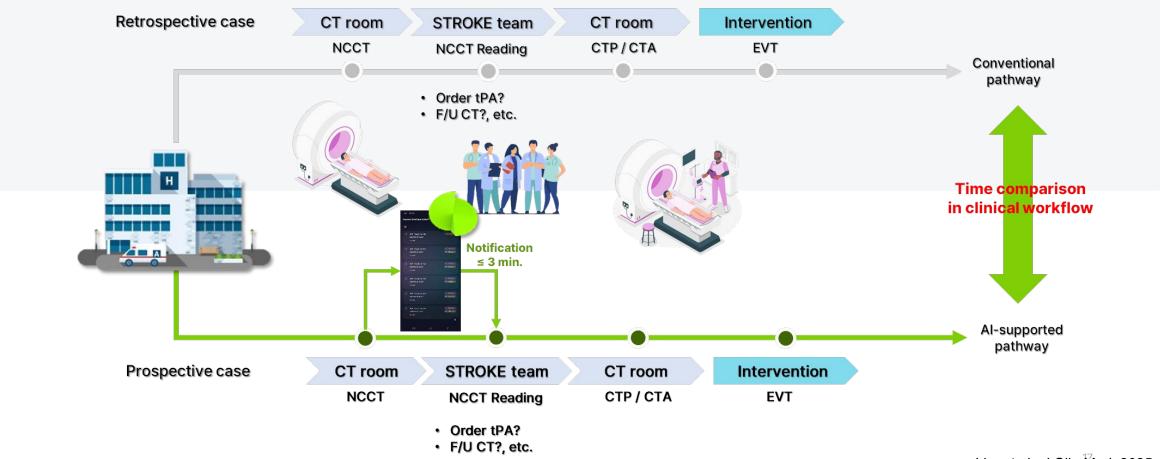
Retrospective & Prospective observation study in single thrombectomy capable stroke center

#### Objective

To compare whether the treatment time could be reduced when an AI supporting system was used

#### Study design

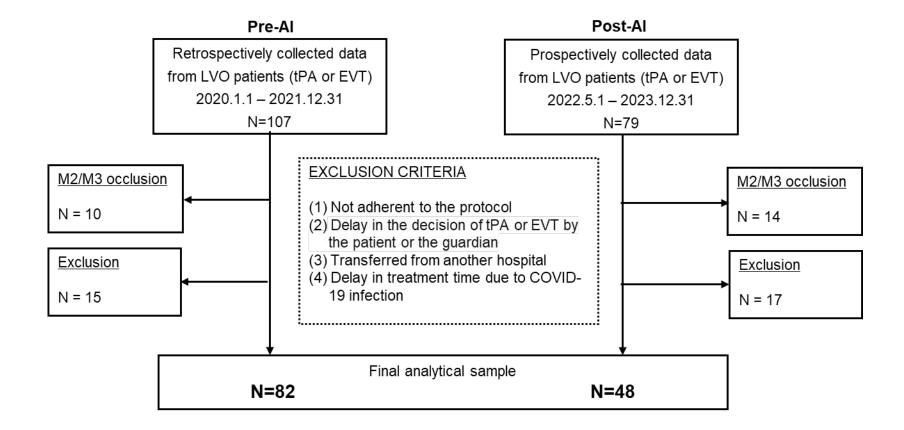
Single-center, retrospective-prospective observational study

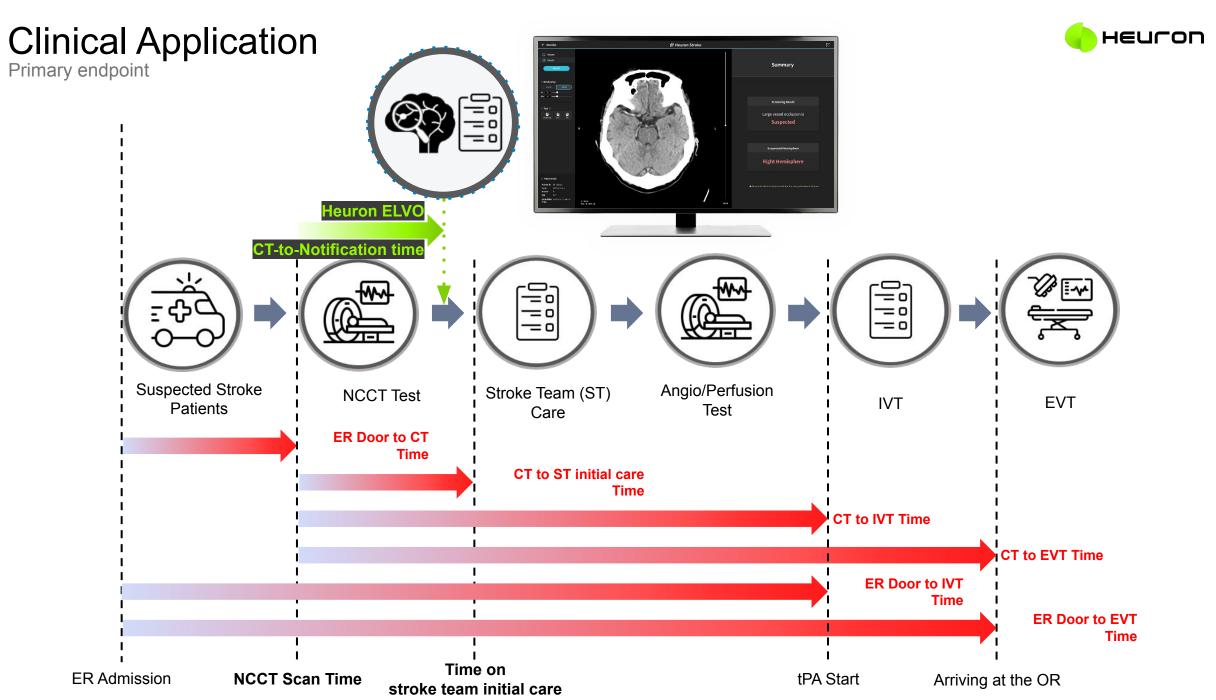


## Flowchart of study Inclusion criteria



- (1) Aged > 19
- (2) Patients suspected of stroke who visited the emergency room and finally diagnosed with acute stroke.
- (3) Performed Mechanical Thrombectomy or receiving tPA (tissue Plasminogen Activator).





## Clinical Application - Results

Total cases [Pre-Al (RS): 82 cases, Post-Al (PS): 48 cases]



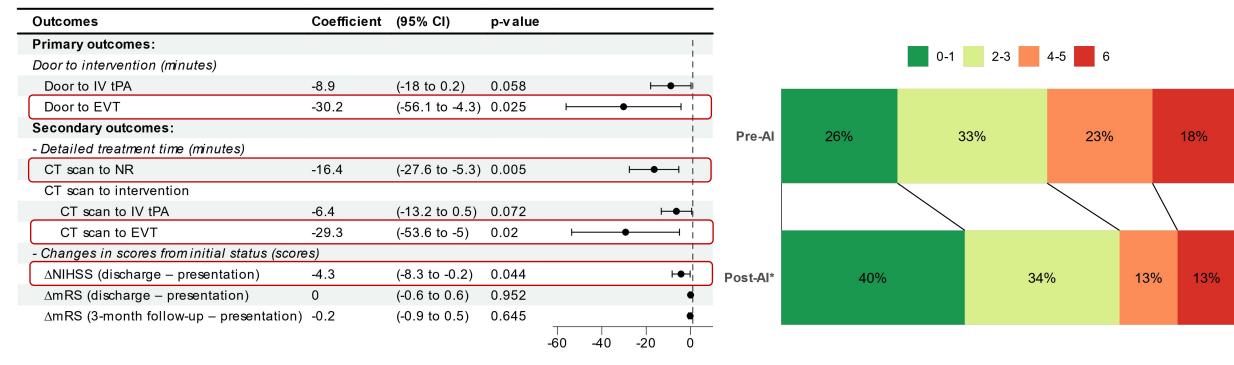


Figure 1. Estimated coefficients of the use of the Al-based stroke detection system using a multivariate linear regression model

Adjustments were made for age (10-year increments), sex, the number of comorbidities, NIHSS at presentation, and clot location.

Abbreviations: CI, Confidence Intervals; CT, Computed Tomography; NR, Neurologist consultation; tPA, tissue Plasminogen Activator; EVT, Endovascular Therapy; NIHSS, National Institutes of Health Stroke Scale; mRS, modified Rankin Scale.

Figure S2. Percentages (%) of mRS at 3-month follow-up

\* One participant in the post-Al cohort was excluded in this figure due to missing information for the mRS score at the 3-month follow-up.

#### Conclusion



- After utilizing the AI solution, the time from CT imaging to the stroke team's initial care and to IVT or EVT were reduced compared to before the application.
- In EVT case, good outcome which was checked 3 months after EVT (mRS 3-months) were increased ratiometrically in the AI supported group.
- Further large-scale evaluation will be needed in multiple-centers.
- Although confirmation through additional validation is required, Heuron StroCare Suite<sup>™</sup> ELVO will be a
  useful tool for clinicians to make fast decision, especially, it will be valuable in remote regions where clinical
  expert may be limited.



# THANK YOU

https://iheuron.com