

# Dyskalemia: From bedside to AI-ECG

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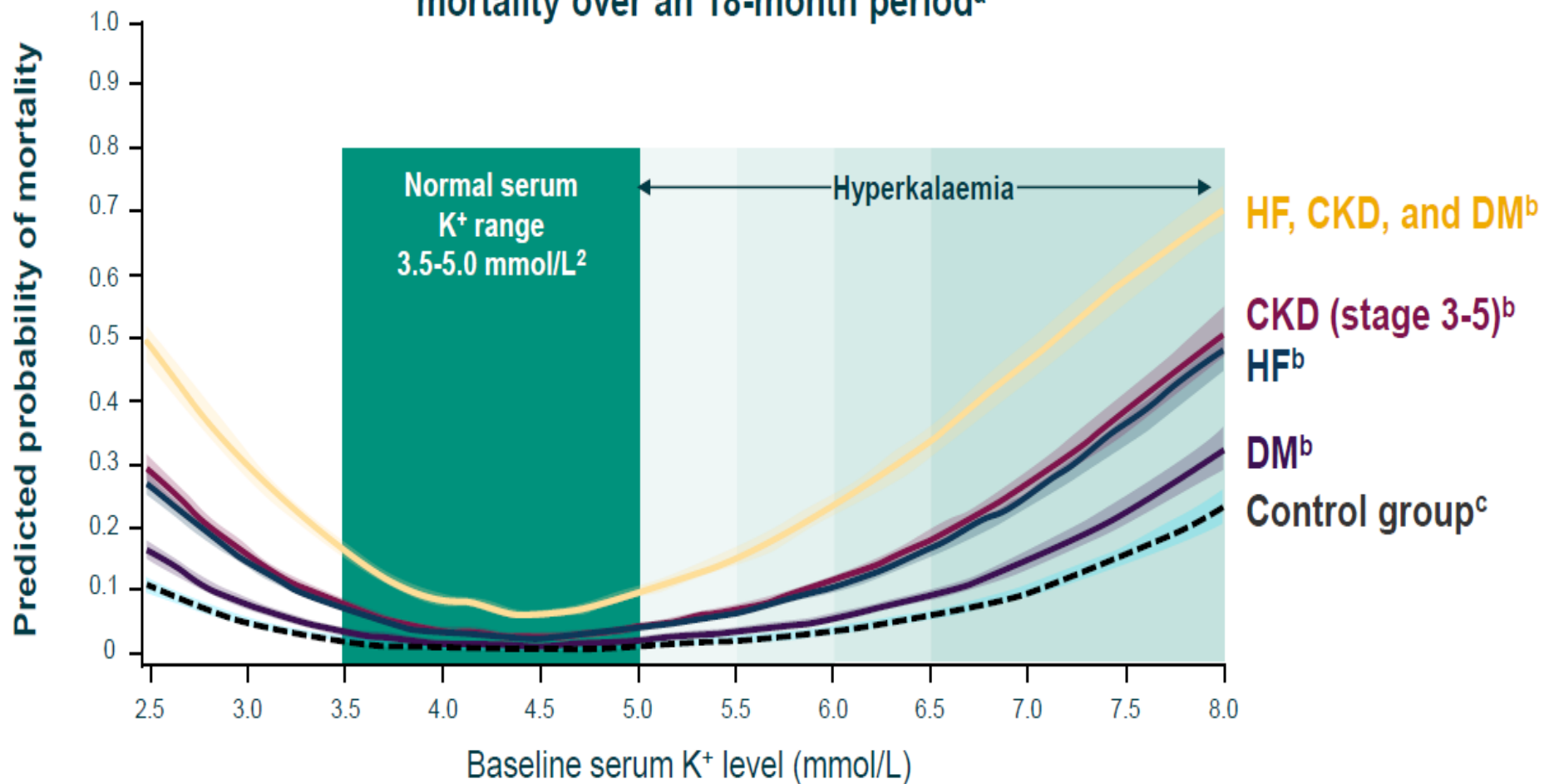
# Lab-Dyskalemia

- Assessment of blood acid-base state and spot urine electrolytes help identify the underlying causes of dyskalemia.
- High urine  $K^+$  excretion rate did not indicate renal tubular diseases. However, **urine  $Na^+$  vs  $Cl^-$**  helps reveal the underlying causes of hypokalemia.
- 24 hour urine with electrolyte excretion reflects therapeutic course and help identify the co-existing  $K^+$  shift and  $K^+$  deficit with **balance analysis**
- To make genetic causes of dyskalemia should exclude other identifiable causes.
- Negative genetic diagnosis should think the possibility of **autoimmune antibody** to target protein

# AI-ECG Dyskalemia

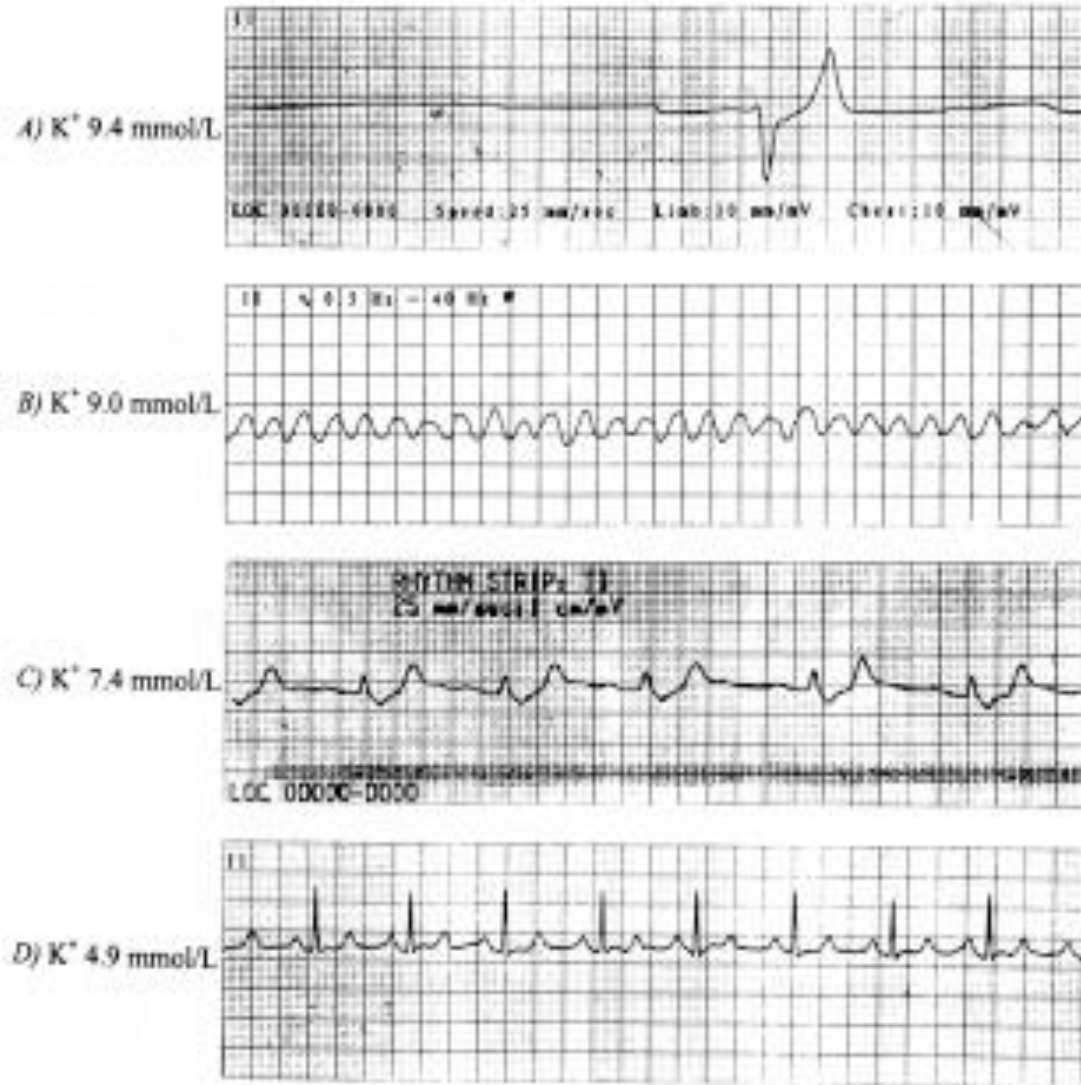
- Early recognition of severe dyskalemia, faster than laboratory testing
- Rapid exclusion of pseudodyskalemia to avoid inappropriate management
- Bloodless monitoring of serum potassium ( $K^+$ ) changes during Rx of severe dyskalemia.
- The identification of the underlying causes for dyskalemia (HP, TPP paralysis, digoxin intoxication)
- Prediction of adverse cardiovascular outcomes (previvor).

## Relationship between serum K<sup>+</sup> value and mortality over an 18-month period<sup>a</sup>



# Simultaneous Hemodialysis and Cardiopulmonary Resuscitation in Successfully Terminating Life-threatening Hyperkalemic Cardiac Arrest

Electrocardiogram (Lead II)



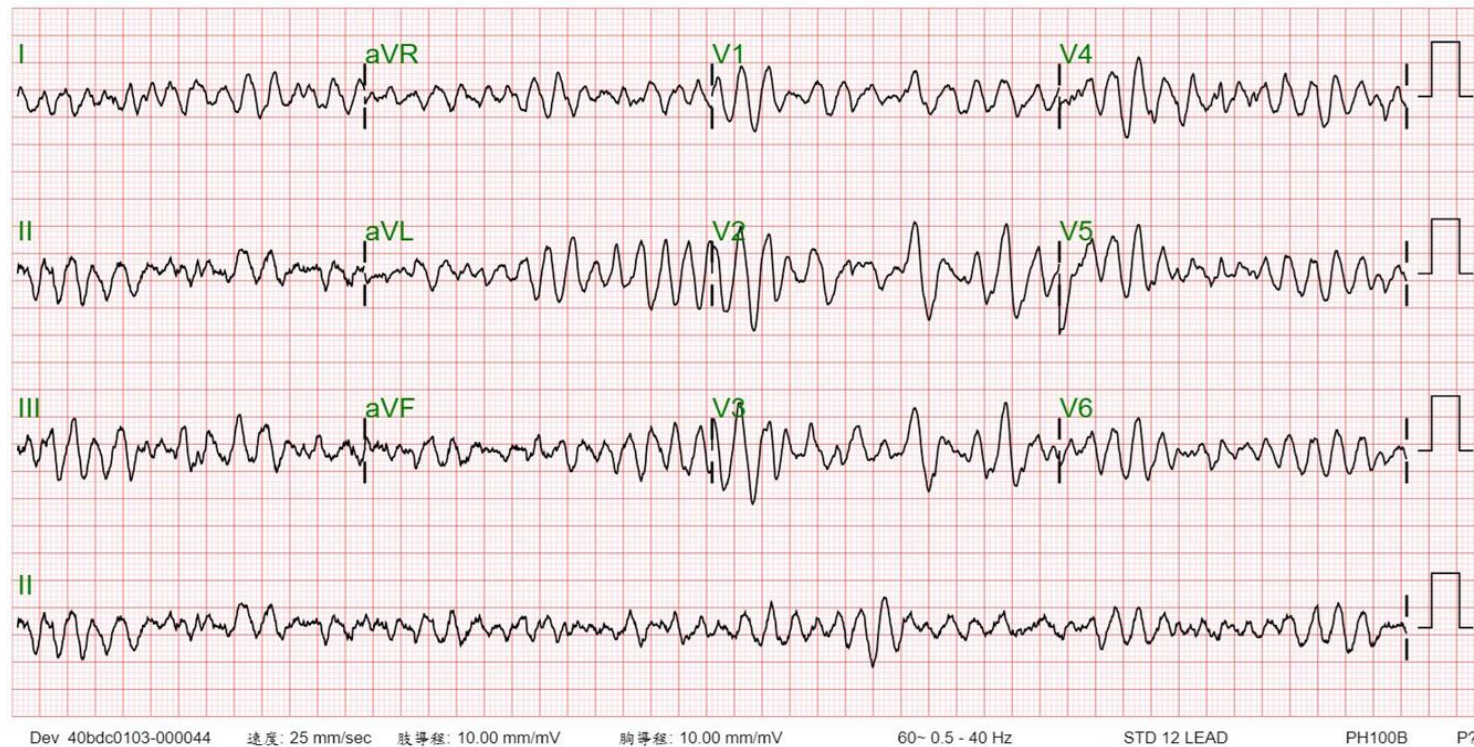
# A 33 Y/O Male with hyperthyroidism presented with palpitation and muscle paralysis

結果: VENTRICULAR FIBRILLATION

報告醫師  
5804  
劉俊傑  
M0309519  
2024/11/08

床號: TMI\_B-ERX402 病歷號: 13491019

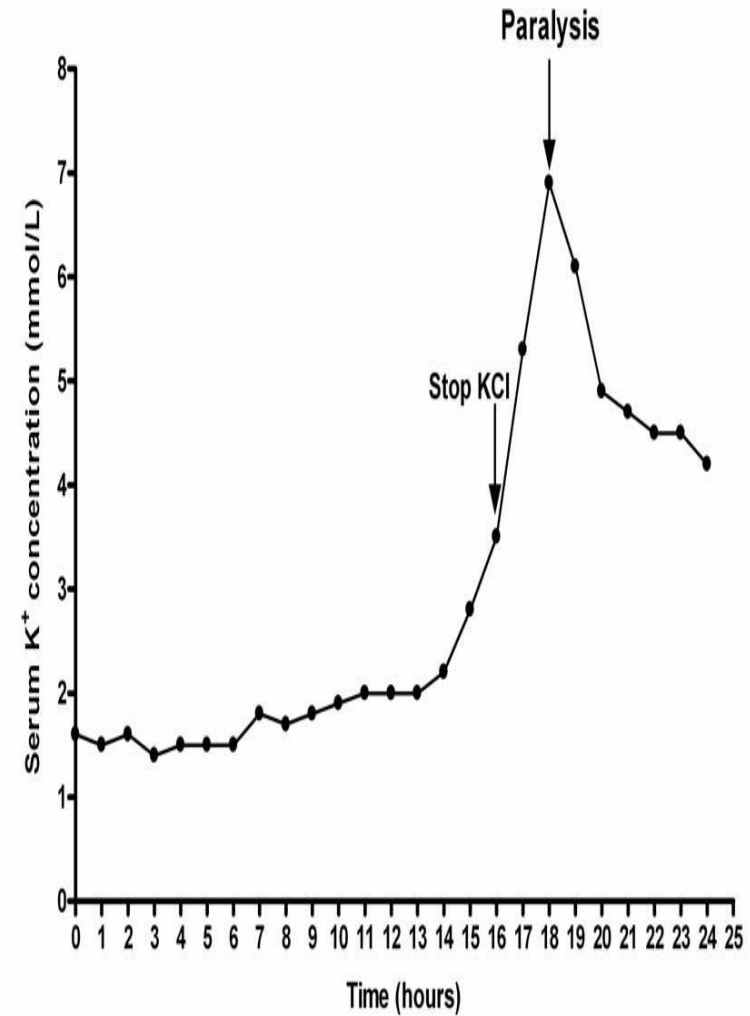
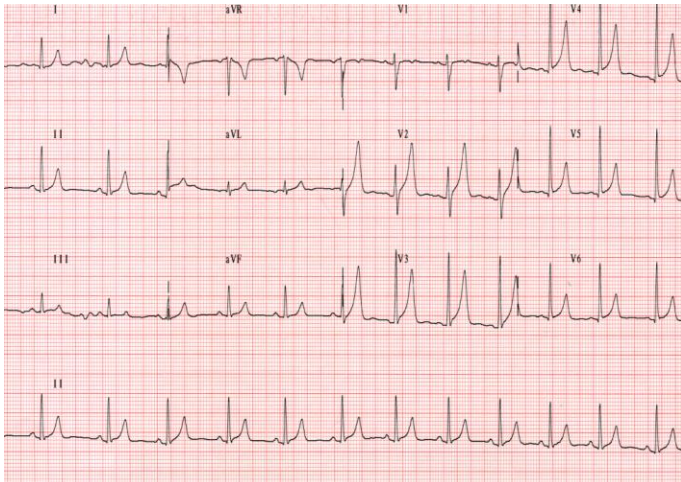
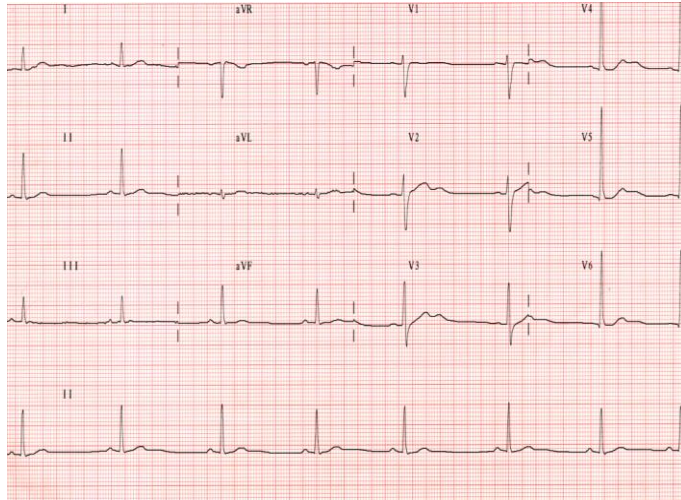
姓名: 晏柏豪 性別: 男  
檢查日期: 2024/10/29 02:50:30 申請日期: 2024/10/29 01:01:00  
數值: PR=108 QRS=201 QT=379 QTc=615  
Axis: P=267 QRS=159 T=267



PK 2.0 to **1.4** mmol/L in 2 hours despite IV KCl 20 mmol

# Recurrent Paralysis in SPP

Lin SH, et al. BMJ Case Report 2009



# How Rapid is “Rapid” to Detect Severe Dyskalemia

- Detection of dyskalemia relies on laboratory tests.
- Since cardiac tissue is sensitive to dyskalemys, electrocardiography (ECG) may be able to uncover clinically important dyskalemys before laboratory.
- Even experienced clinicians frequently do not recognize the ECG morphologic changes associated with dyskalemys.
- Using ECG-based DLM with large annotated data, we successfully developed ECG-12Net to help predict severe dyskalemia in seconds.

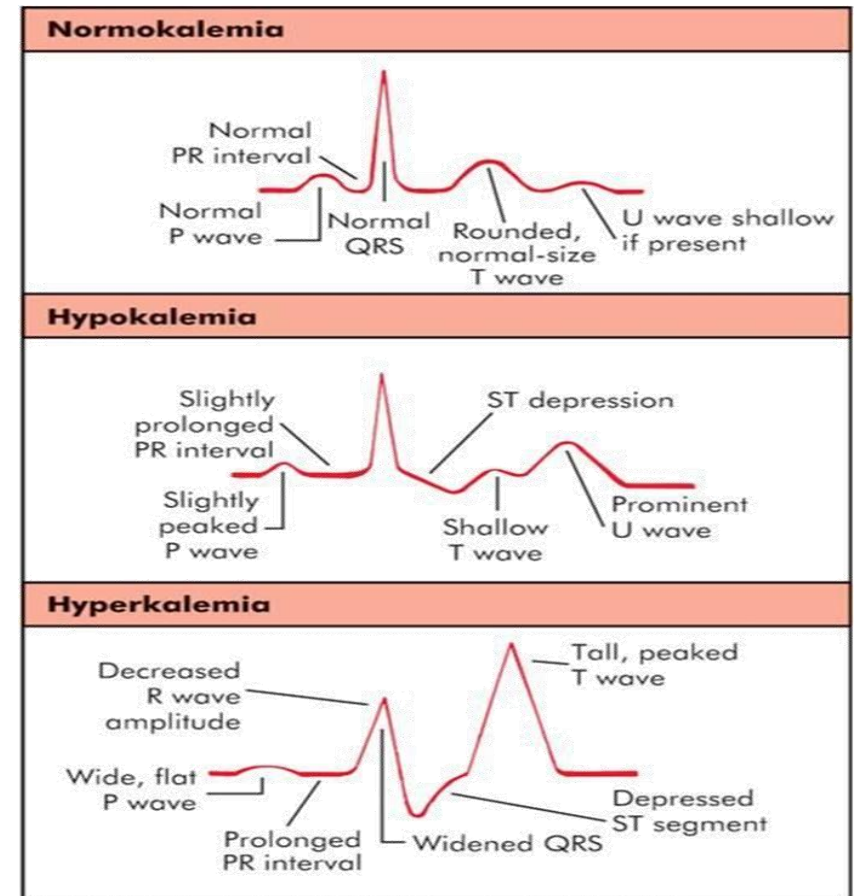
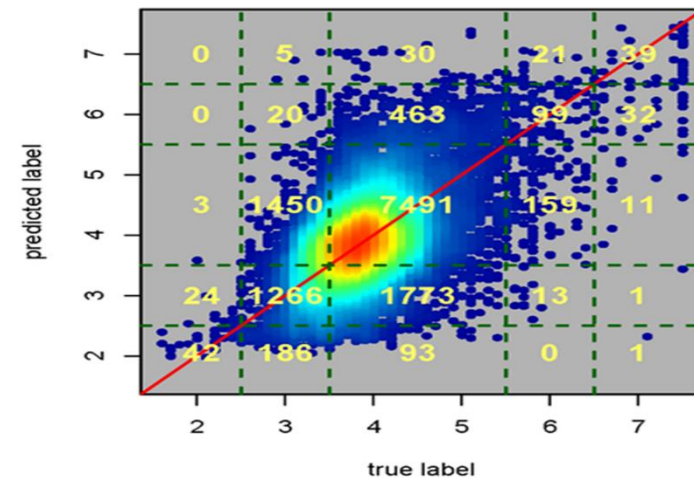
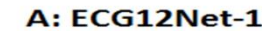
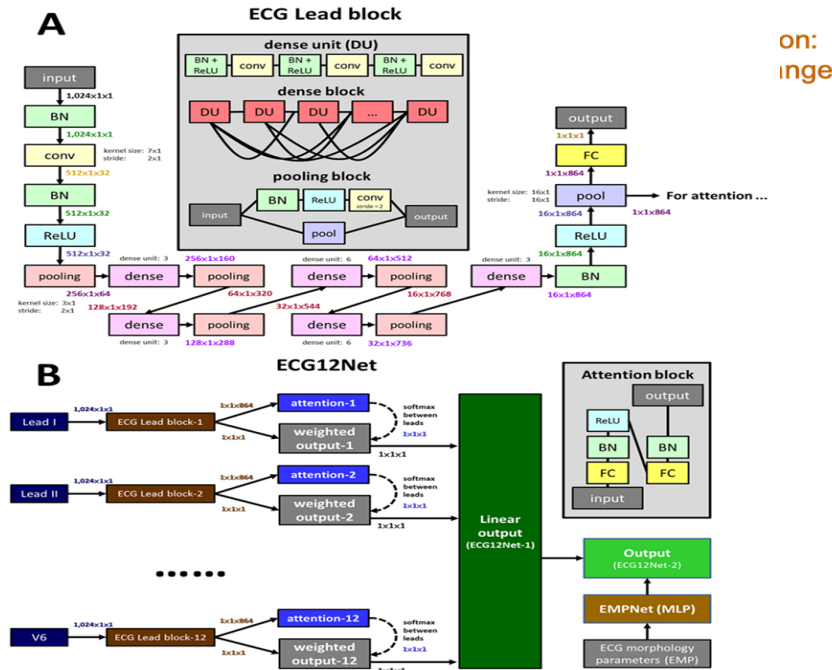
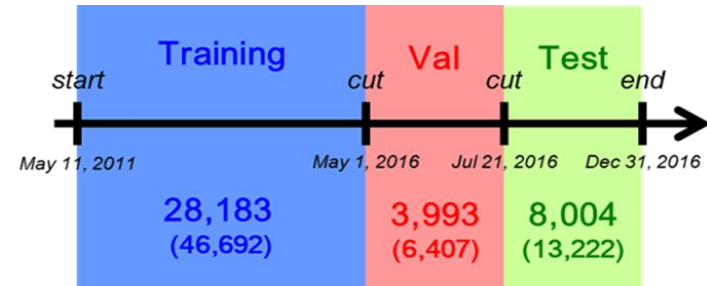
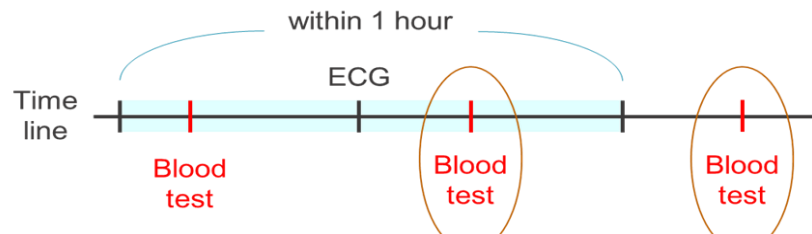


Fig. 4-7. Electrocardiogram Changes with Potassium Imbalance  
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# Bloodless AI-ECG for the detection of Dyskalemia using large annotated serum $K^+$

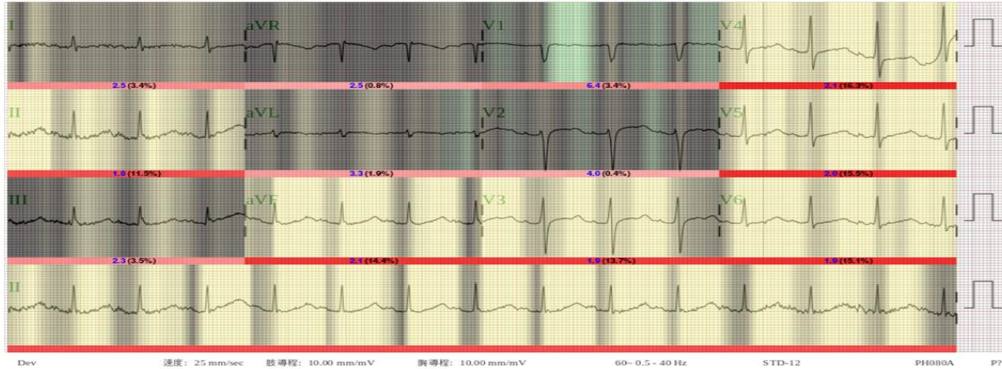


**Sens (severe-hypoK): 95.6%**  
**(severe hyperK): 84.5%**

Lin CS et al, JMIR Med Inform 2020

# Visualization analysis for ECG12Net in selected severe hypokalemia and hyperkalemia.

**A**  $[K^+]$  2.3



AI prediction:

$K^+ = 2.2$

Rate: 85  
PR: 169  
QRSd: 115  
QT: 496  
QTc: 590  
Axes\_P: 0  
Axes\_RS: 75  
Axes\_T: 65

**c**  $[K^+]$  9.1

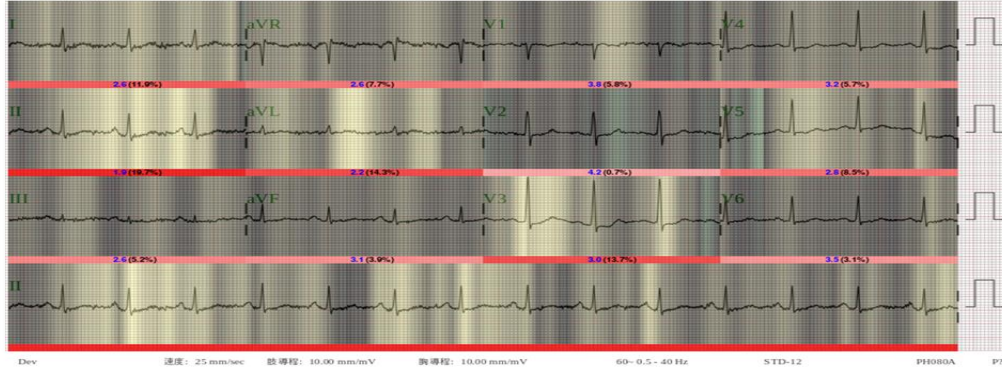


AI prediction:

$K^+ = 7.5$

Rate: 68  
PR: 230  
QRSd: 173  
QT: 437  
QTc: 465  
Axes\_P: 62  
Axes\_RS: 134  
Axes\_T: 56

**B**  $[K^+]$  2.5



AI prediction:

$K^+ = 2.5$

Rate: 86  
PR: 185  
QRSd: 83  
QT: 348  
QTc: 417  
Axes\_P: 73  
Axes\_RS: 38  
Axes\_T: 22

**D**  $[K^+]$  7.1



AI prediction:

$K^+ = 7.2$

Rate: 98  
PR: 161  
QRSd: 188  
QT: 408  
QTc: 521  
Axes\_P: -52  
Axes\_RS: 57  
Axes\_T: -58

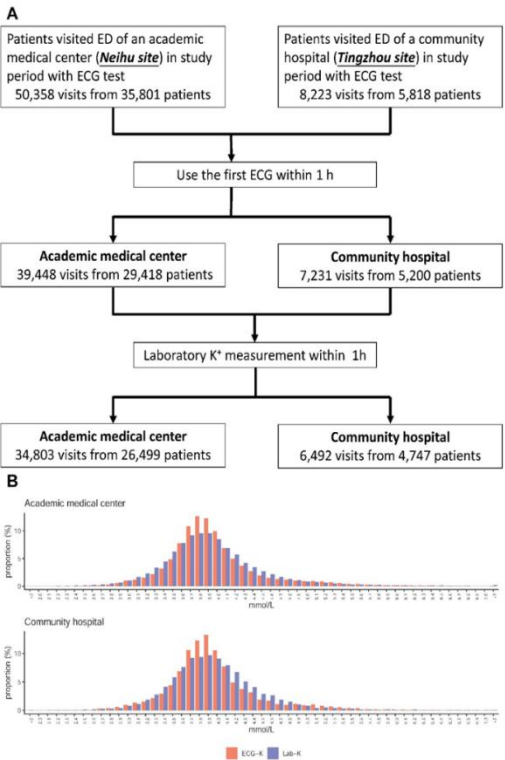
# Comparison with Previous Studies

|                                                           | This study                   | Galloway et al.                         |
|-----------------------------------------------------------|------------------------------|-----------------------------------------|
| <b>Sample size</b>                                        | 66,321                       | 1,576,581                               |
| <b>Patients</b>                                           | <b>ED</b>                    | <b>CKD, stage <math>\geq</math> III</b> |
| <b>Blood K<sup>+</sup></b>                                | <b>Dyskalemia</b>            | <b>Hyperkalemia</b>                     |
| <b>Blood K<sup>+</sup> and ECG recording</b>              | <b>1hr &lt; ECG &lt; 1hr</b> | <b>&lt;12 hrs</b>                       |
| <b>Prediction type</b>                                    | <b>Continuous</b>            | Binary                                  |
| <b>ECG lead</b>                                           | <b>12 leads</b>              | <b>2 (I,II) or 4 leads</b>              |
| <b>Hyperkalemia (K<sup>+</sup> <math>\geq</math> 5.5)</b> |                              |                                         |
| AUCs                                                      | 0.911                        | 0.853-0.883                             |
| Sensitivity                                               | 41.1- <b>84.5%</b>           | 81.3-84.0%                              |
| Specificity                                               | <b>96.0%</b>                 | 77.0-84.2%                              |
| Positive predictive value                                 | 26.9%                        | 11.9-15.4%                              |
| Negative predictive value                                 | 98.5%                        | 99.0-99.4%                              |
| <b>Hypokalemia (K<sup>+</sup> <math>\leq</math> 3.5)</b>  |                              |                                         |
| AUCs                                                      | 0.750                        | NA                                      |
| Sensitivity                                               | 49.6- <b>95.6%</b>           | NA                                      |
| Specificity                                               | <b>81.6%</b>                 | NA                                      |
| Positive predictive value                                 | 44.7%                        | NA                                      |
| Negative predictive value                                 | 85.0%                        | NA                                      |
| <b>Human-Machine Competition</b>                          | Yes                          | No                                      |



# Bloodless AI-ECG K<sup>+</sup> Helps Predict the Outcome

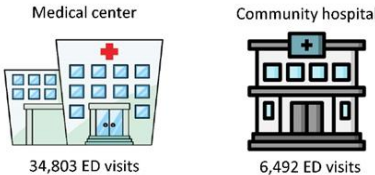
## Black-Box Validation after May, 2019



### Point-of-care in 10 seconds



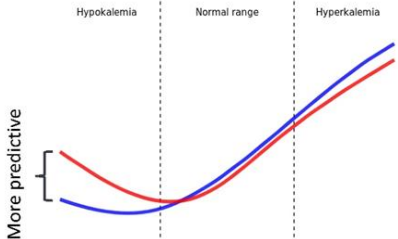
### Multisite prospective validation



### Advantage in time



### Advantage in outcome predictions



### Accurate and meaningful

|               | Dyskalemia         | Normal             |
|---------------|--------------------|--------------------|
| AI-identified | TP: True positive  | FP: False positive |
| AI-negative   | FN: False negative | TN: True negative  |

**Sensitivity [TP/(TP+FN)]:**  
 for severe hypokalemia: 93.3%/93.3%  
 for severe hyperkalemia: 93.8%/100.0%

**Specificity [TN/(TN+FP)]:**  
 for severe hypokalemia: 84.7%/85.4%  
 for severe hyperkalemia: 91.8%/92.3%

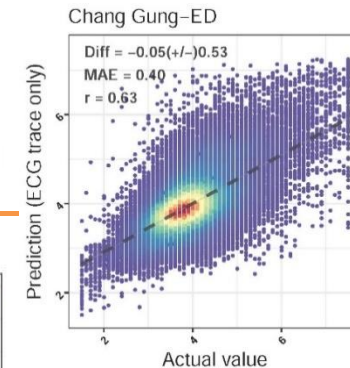
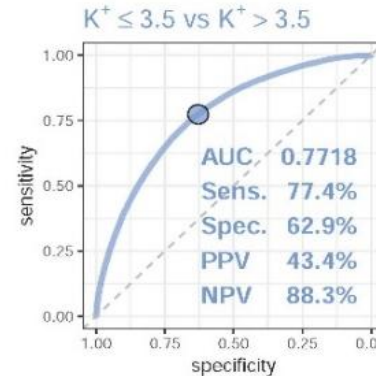
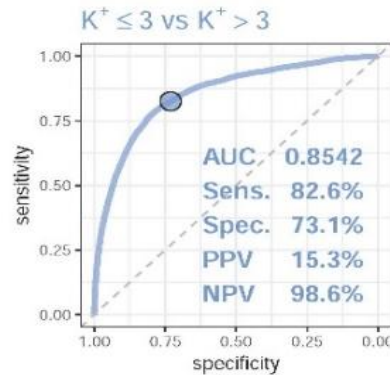
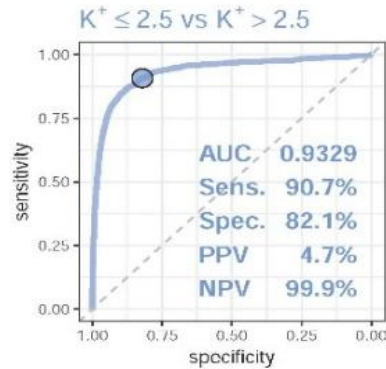
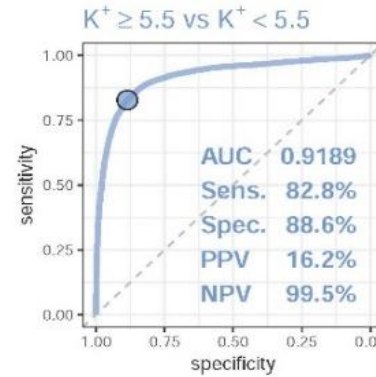
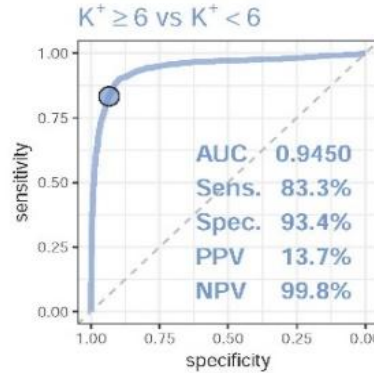
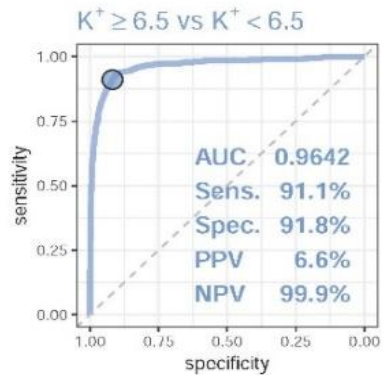
**Area under ROC curve:**  
 for severe hypokalemia: 0.9497/0.9194  
 for severe hyperkalemia: 0.9658/0.9865

Higher risk of adverse outcomes

Lower risk of adverse outcomes

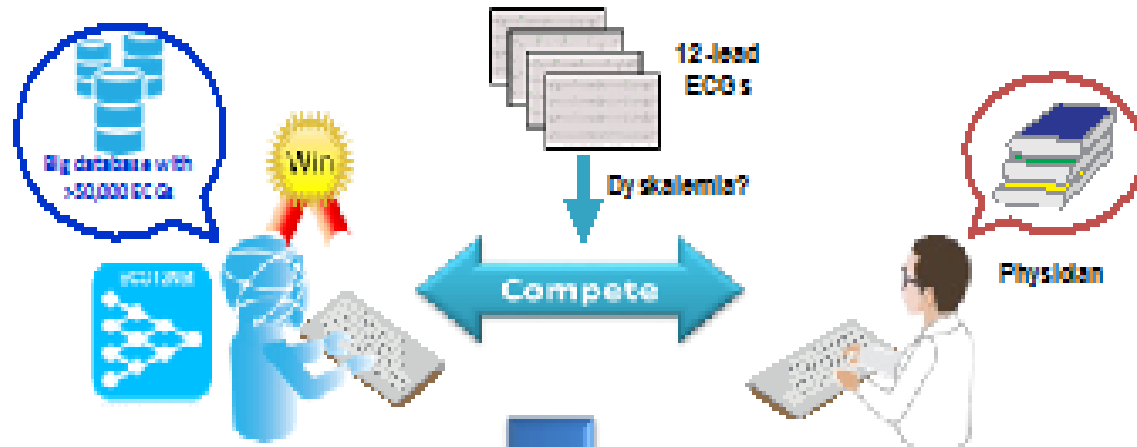
# A Cross-system External Validation at CGMH (GE)

Chang Gung-ED

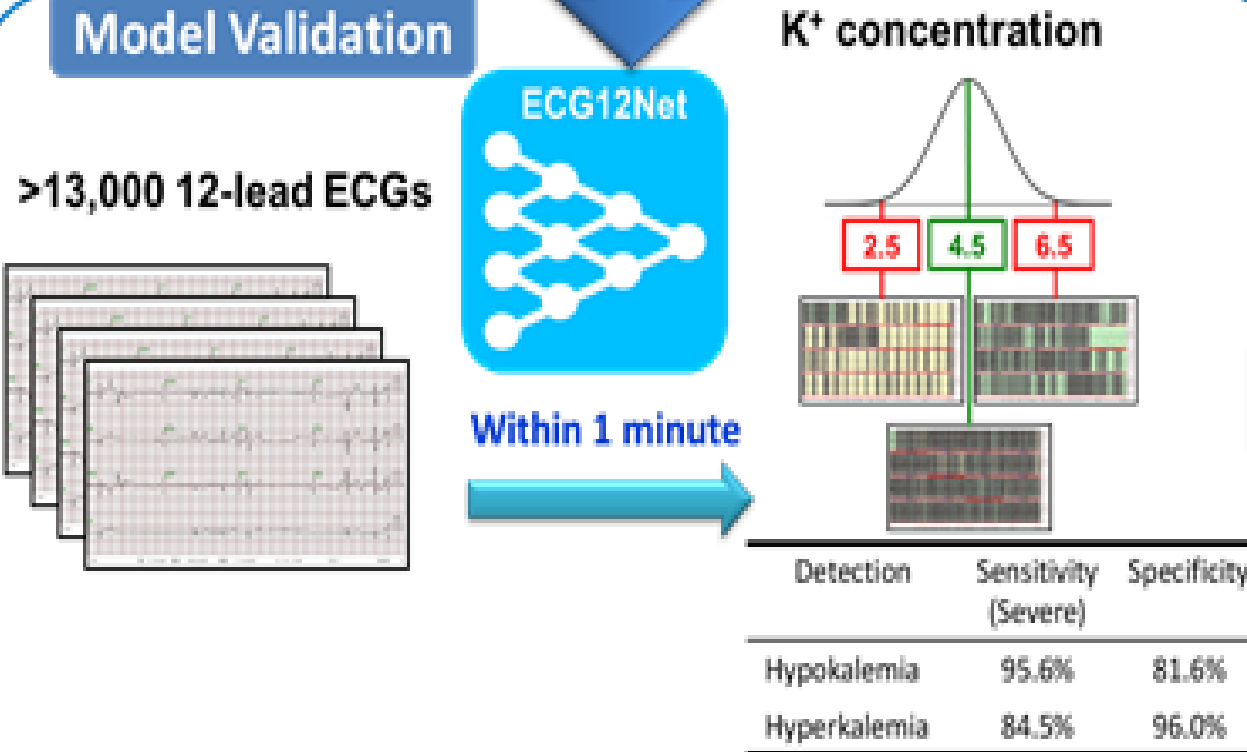


# Taiwan Innovation Award 2020

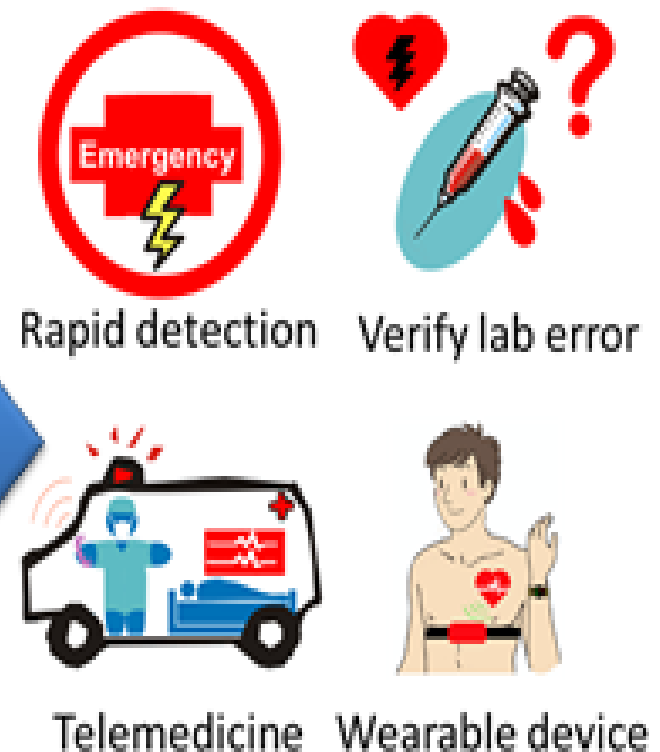
## Model Establishment



## Model Validation



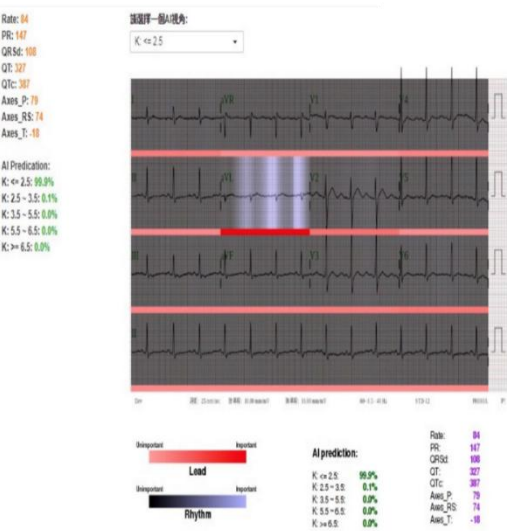
## Future Application



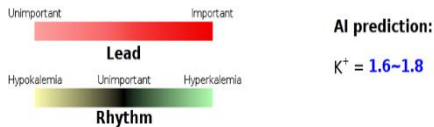
# Early Detection of Severe Dyskalemia and Laboratory Error

Case : A Young Male with Muscle Paralysis

A 24 Y/O Male with Chronic Hypokalemia (GS) at OPD



K<sup>+</sup>: 2.2



| 檢驗代碼          | 檢驗結果           | 檢驗結果單位 | 最小/最大安全值   |
|---------------|----------------|--------|------------|
| GLU (ER)      | 120            | mg/dL  | 74 - 100   |
| BUN           | 15             | mg/dL  | 7 - 25     |
| eGFR          | 36.7<br>Stage2 |        |            |
| Creatinine    | 1.1            | mg/dL  | 0.7 - 1.2  |
| Uric Acid     | 4.7            | mg/dL  | 2.3 - 7.0  |
| Total Calcium | 9.6            | mg/dL  | 8.6 - 10.2 |
| AST           | 31             | U/L    | - 40       |
| ALT           | 37             | U/L    | - 41       |
| Total Protein | 8.2            | g/dL   | 6.6 - 8.7  |
| Albumin       | 4.5            | g/dL   | 3.5 - 5.7  |
| A/G Ratio     | 1.2            |        | 1.2 - 2.4  |
| Na            | 135            | mmol/L | 136 - 145  |
| K             | 1.6            | mmol/L | 3.5 - 5.1  |
| Cl            | 100            | mmol/L | 98 - 107   |
| Magnesium     | 1.9            | mg/dL  | 1.7 - 2.55 |
| PANIC INFORM  |                |        |            |
| 通知日期          | 20/08/01       |        |            |
| 通知時間          | 11h03m         |        |            |
| 通知電話          | 12501          |        |            |
| 被通知人          | DR. 林          |        |            |
| 通知者           | 申建人            |        |            |

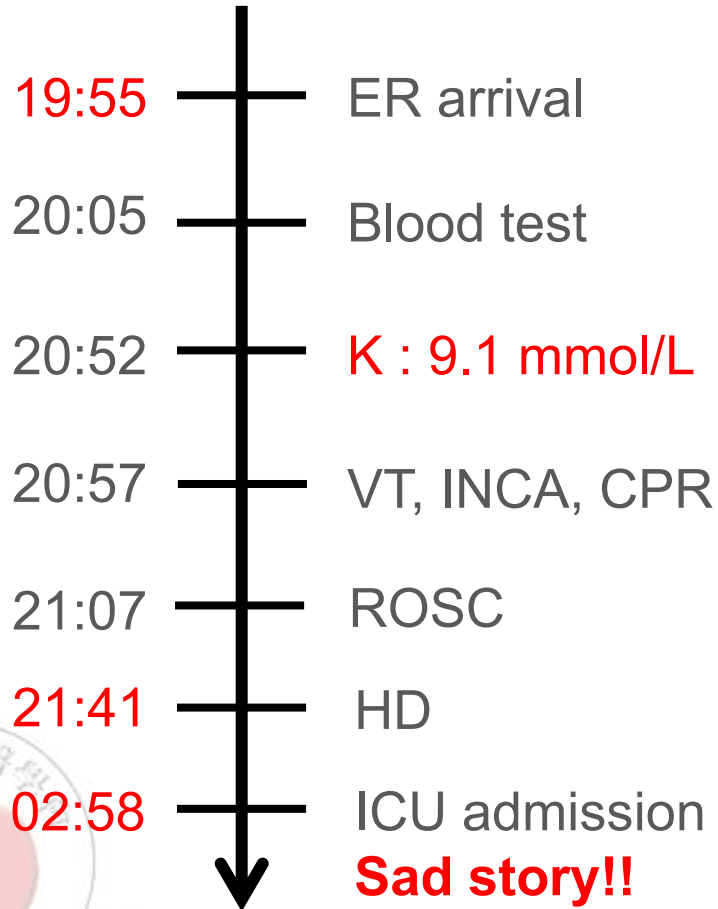
A 52-year-old: DM and CKD stage IV female with laboratory hypokalemia (2.6 mmol/L)



Lab K: 7.1 mmol/L

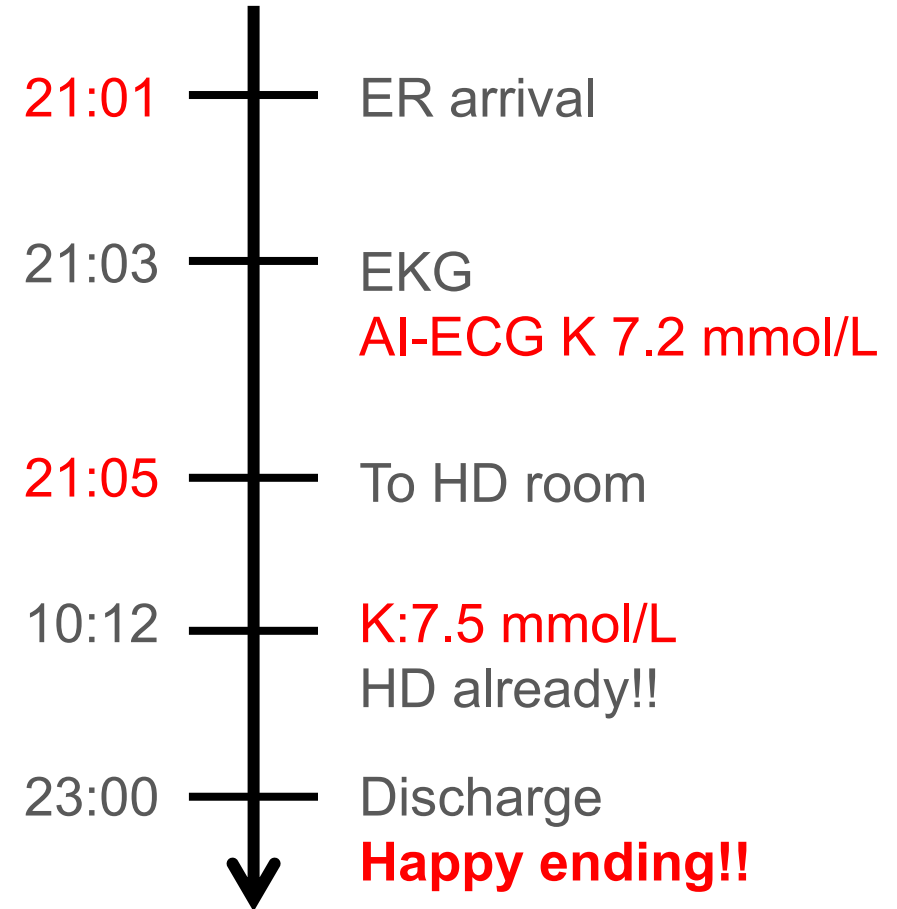
53/F, ESRD

Time to HD: 1 h 46 min



58/M, ESRD

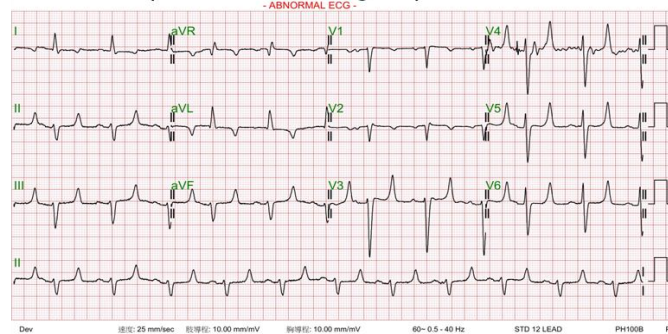
Time to HD: 4 min



# Recurrent Hyperkalemia and Persistent ECG hyperkalemia Following Parathyroidectomy with HBS

## 1<sup>st</sup> Episode

K<sup>+</sup>: 6.7 mmol/L | Total Ca<sup>2+</sup>: 5.8 mg/dL | Ionized Ca<sup>2+</sup>: 2.83 mg/dL

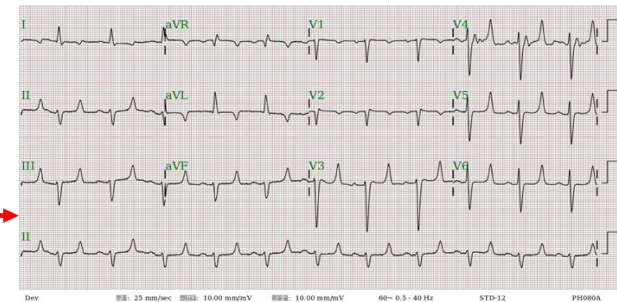


Unimportant      important  
**Lead**  
Hypokalemia      Unimportant      Hyperkalemia  
**Rhythm**

AI prediction:

K<sup>+</sup> = 7.245

Rate: 67  
PR: 209  
QRSd: 142  
QT: 501  
QTc: 529  
Axes\_P: 25  
Axes\_RS: -63  
Axes\_T: 99



AI prediction:

**aCa High risk 6.7**

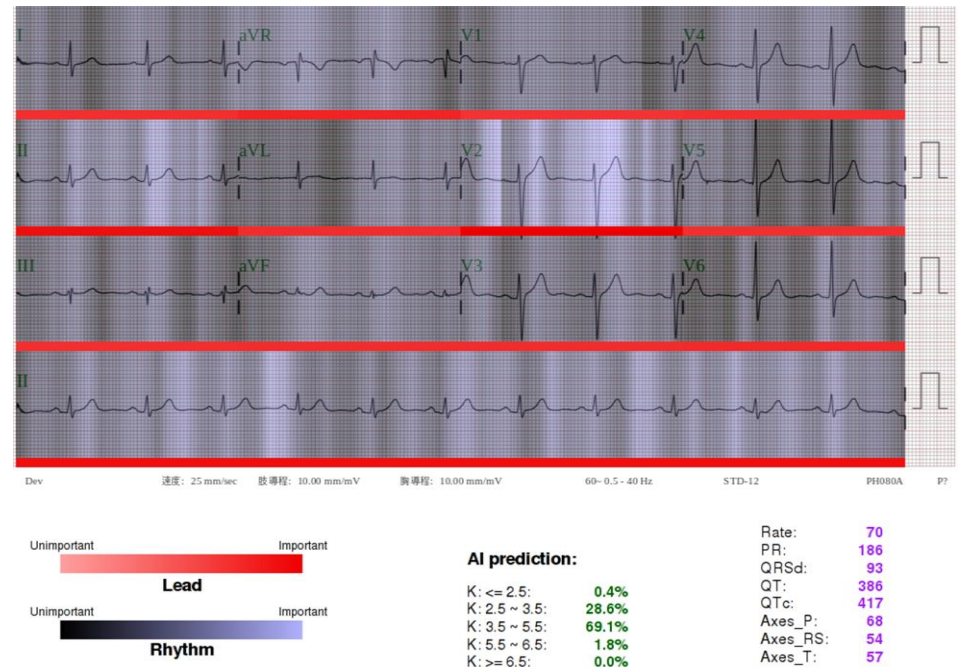
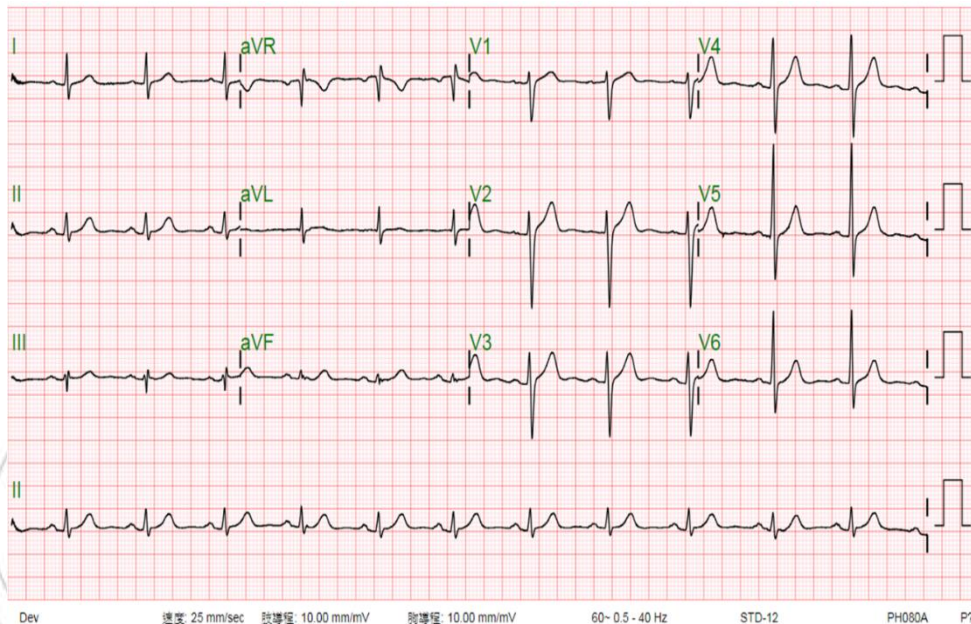
Rate: 67  
PR: 209  
QRSd: 142  
QT: 501  
QTc: 529  
Axes\_P: 25  
Axes\_RS: -63  
Axes\_T: 99

Lu A, et al. Best poster presentation in ASN 2024 Invited for publication

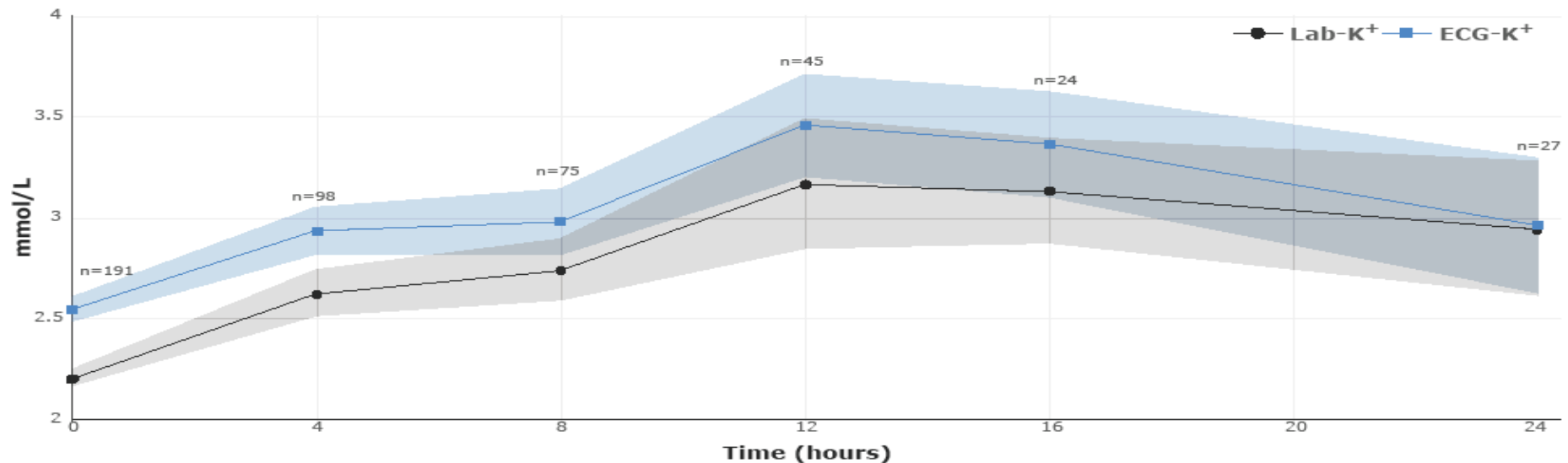
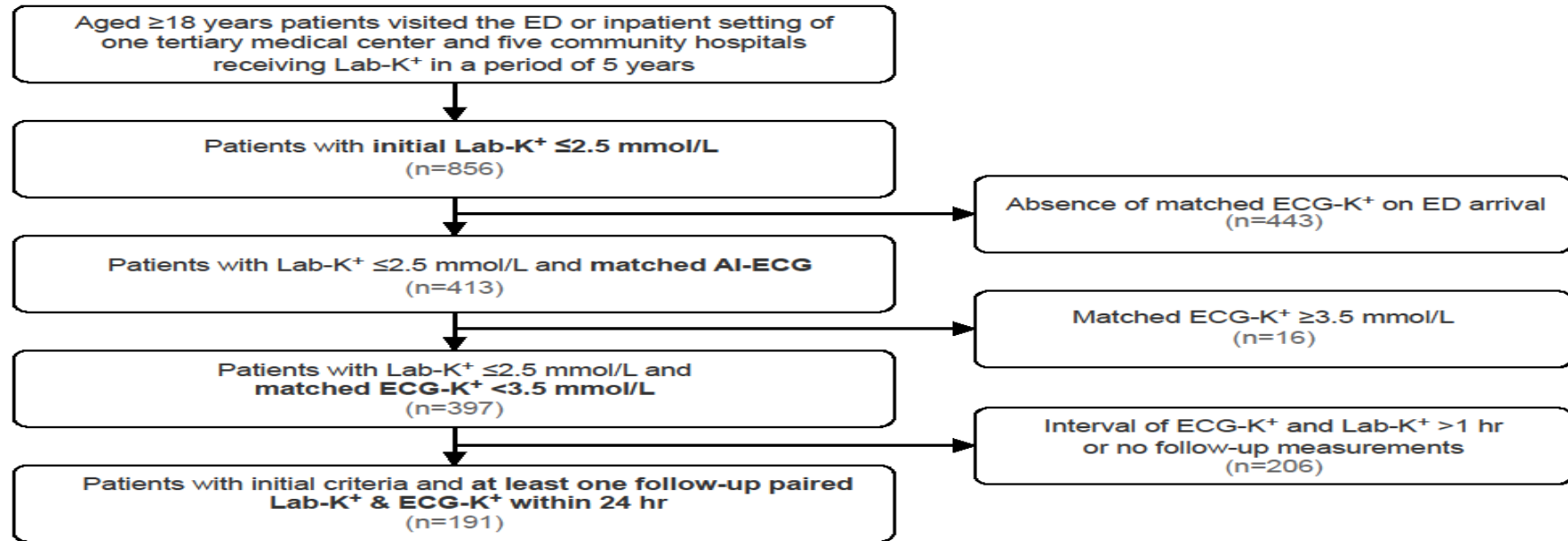
# Case: A Male with Extreme Hyperkalemia

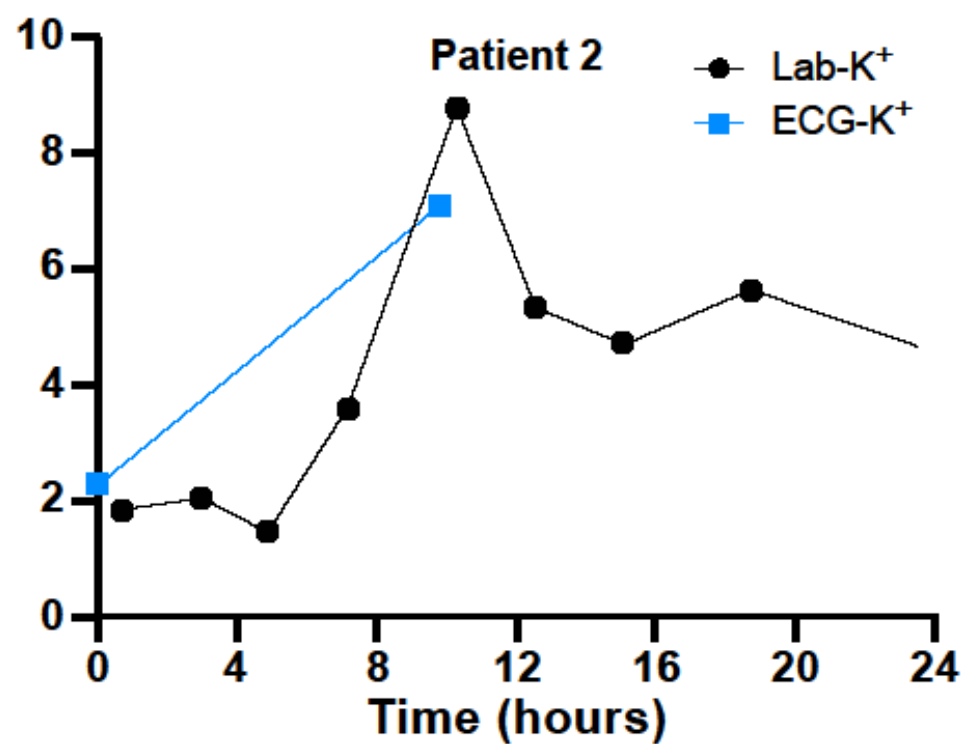
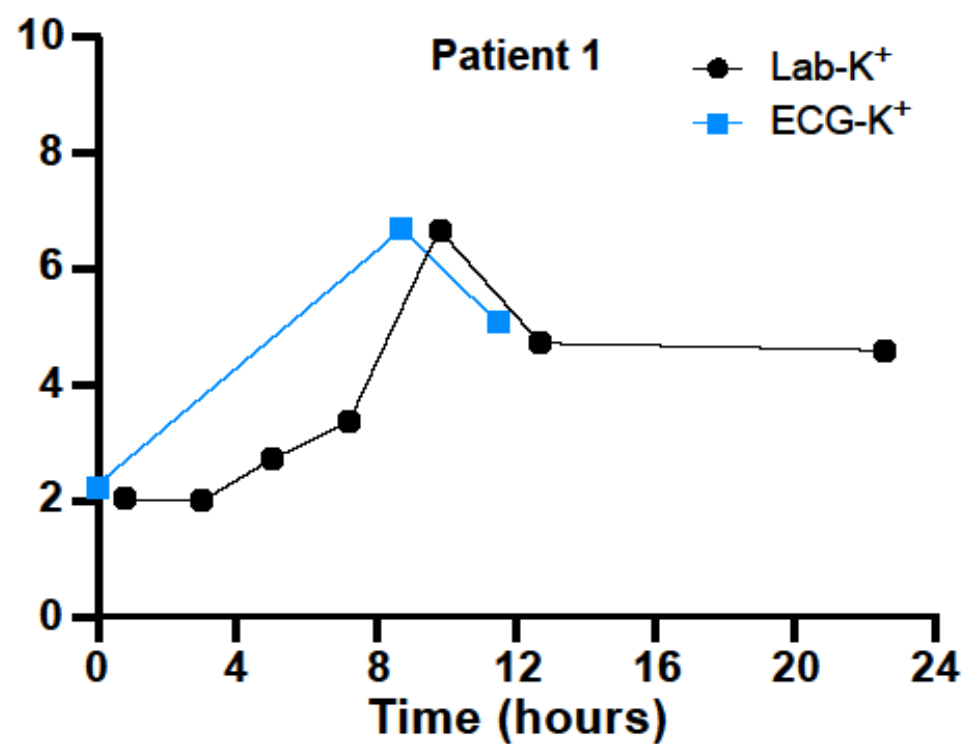
- A 47- year-old male , Height: 156 cm, Weight: 65 Kg
- Clinical presentation: intermittent dyspnea, lower limbs edema for days  
No muscle cramps, weakness, paralysis, paresthesias, tetany  
and no focal neurologic deficits

**Other H→ leukocytosis, Hyperkalemia (>9mmol/L) noted→ Refer to TSGH.  
Rx: Lab: K<sup>+</sup> 9.1 mmol/L, hemodialysis, yes or no?**

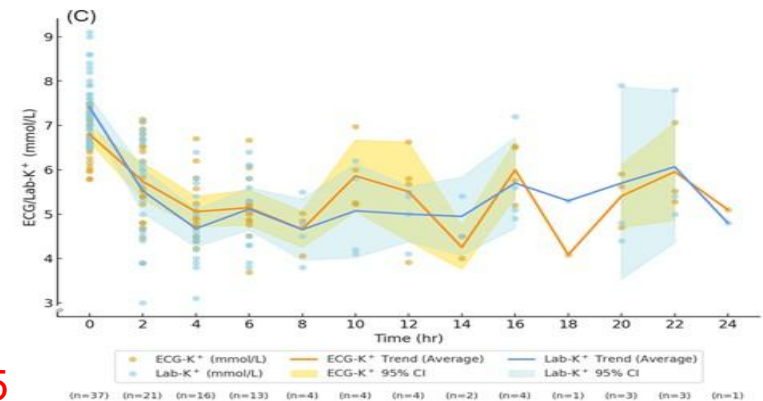
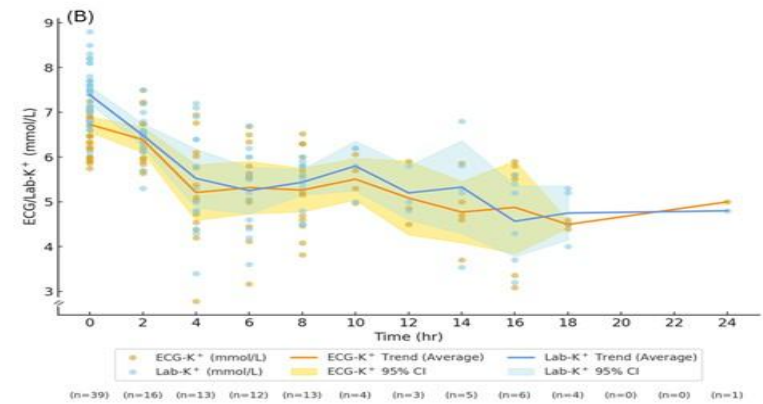
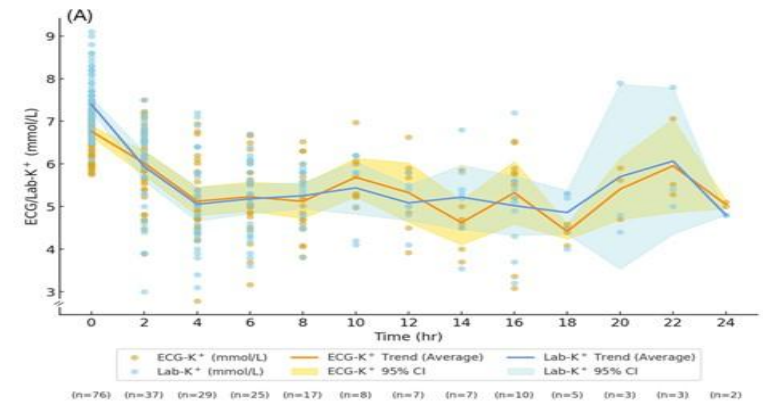
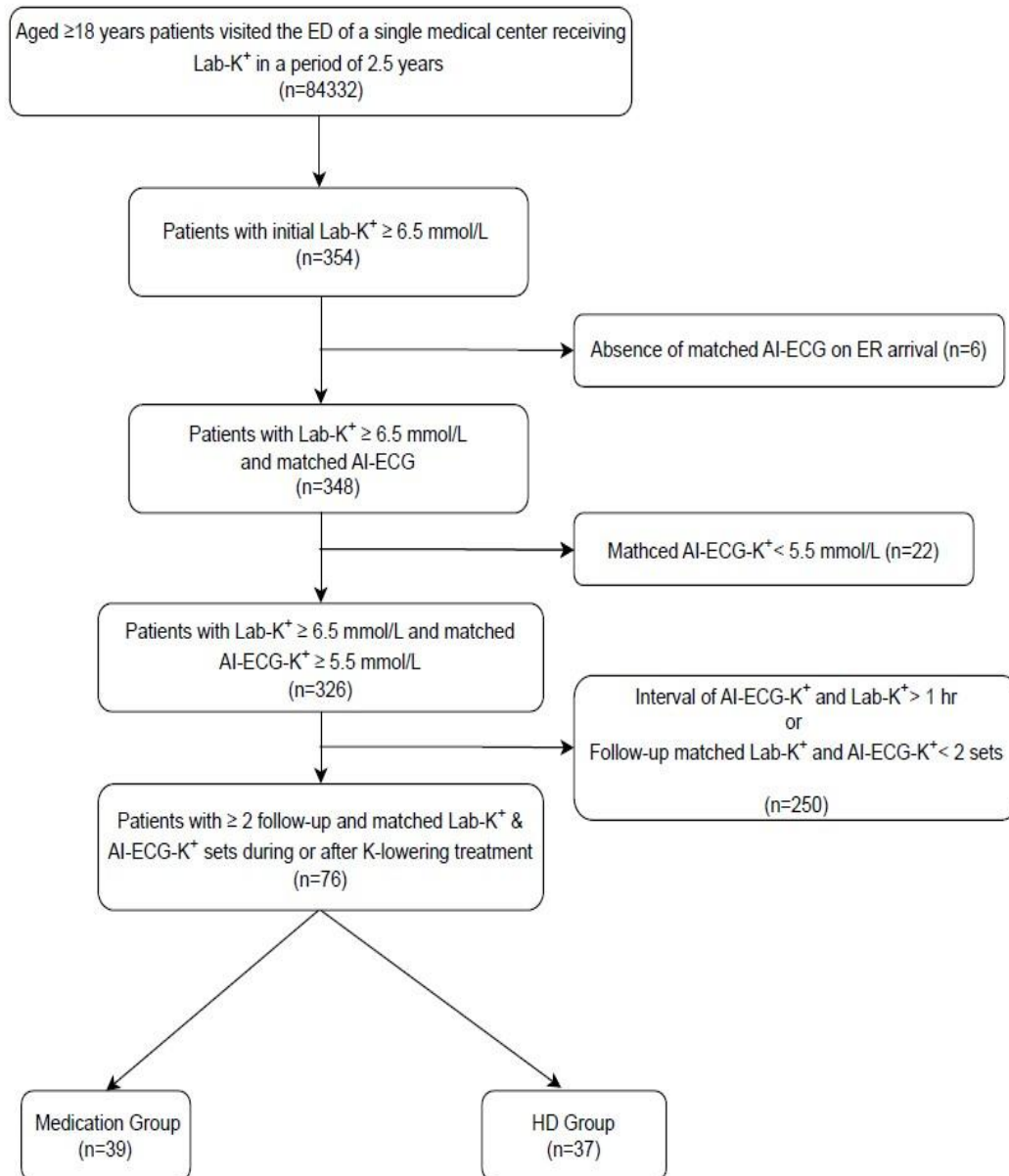


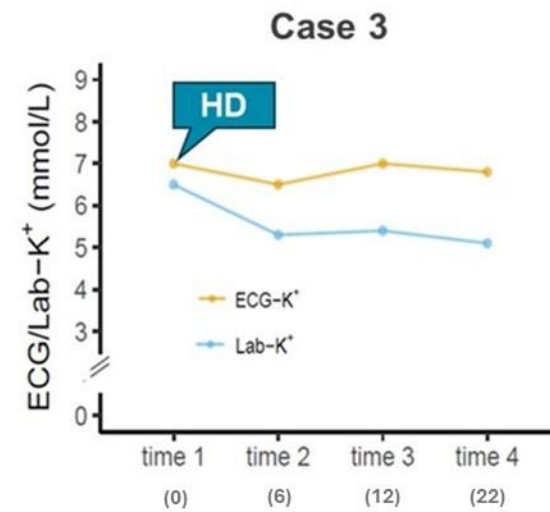
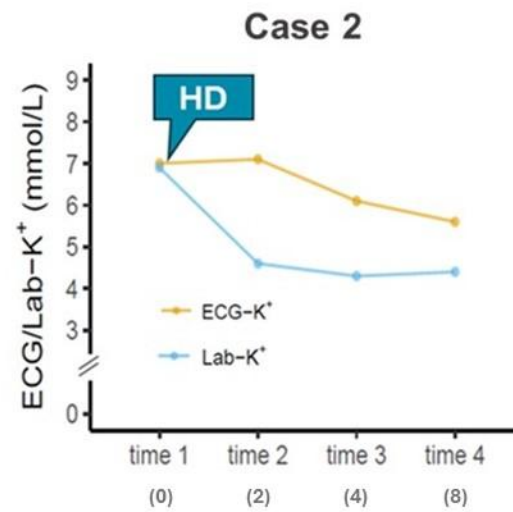
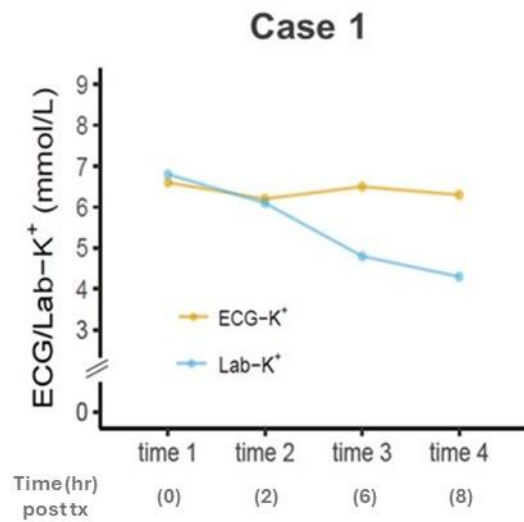
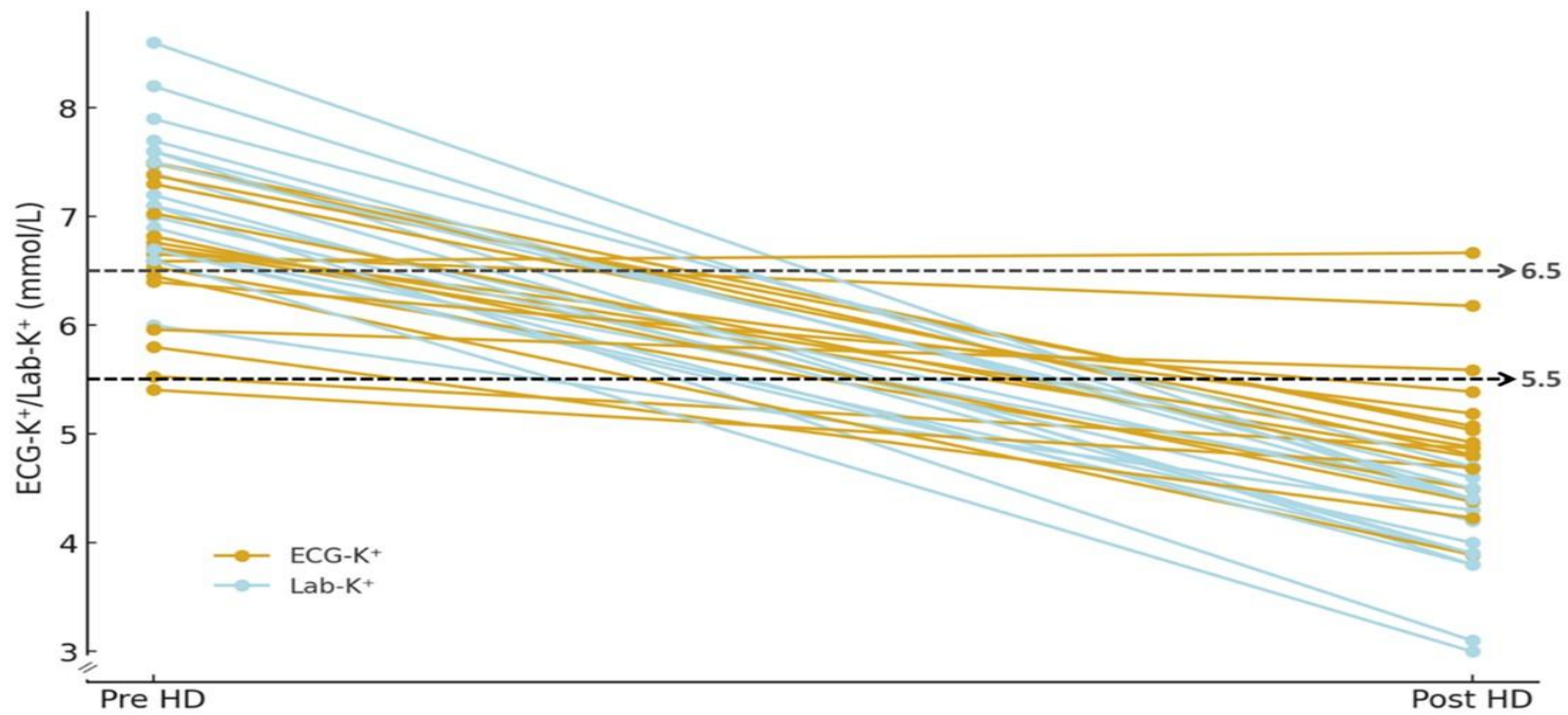
# (III) Help monitor serum K<sup>+</sup> change during Rx





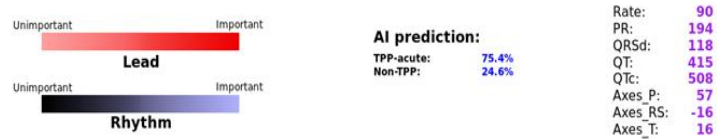
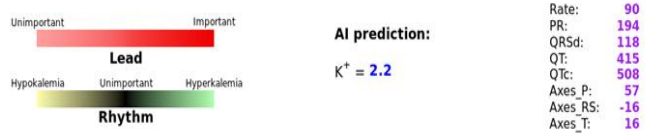
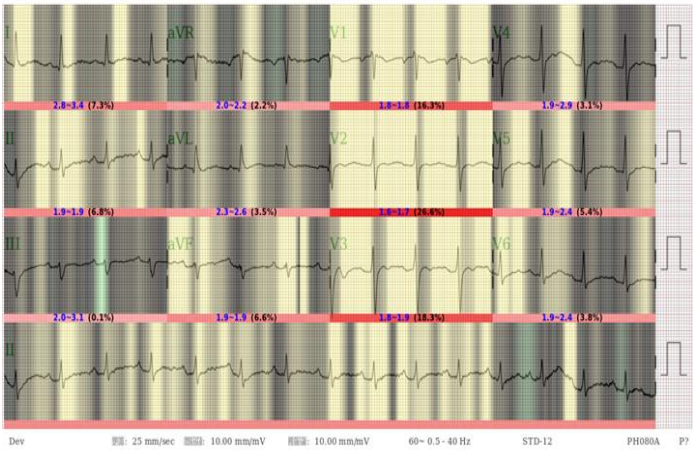
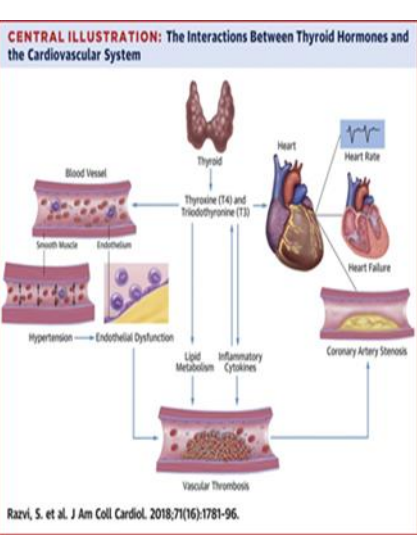
# Monitoring Serum Potassium Concentration in Patients with Severe Hyperkalemia: the Role of Bloodless AI-Assisted Electrocardiography





TPP: ECG  
Hyperthyroidism on heart  
Hypokalemia on heart  
K Shift into cells

AI-ECG for Help Diagnose the causes of Hypokalemic Paralysis:  
TPP vs non-TPP

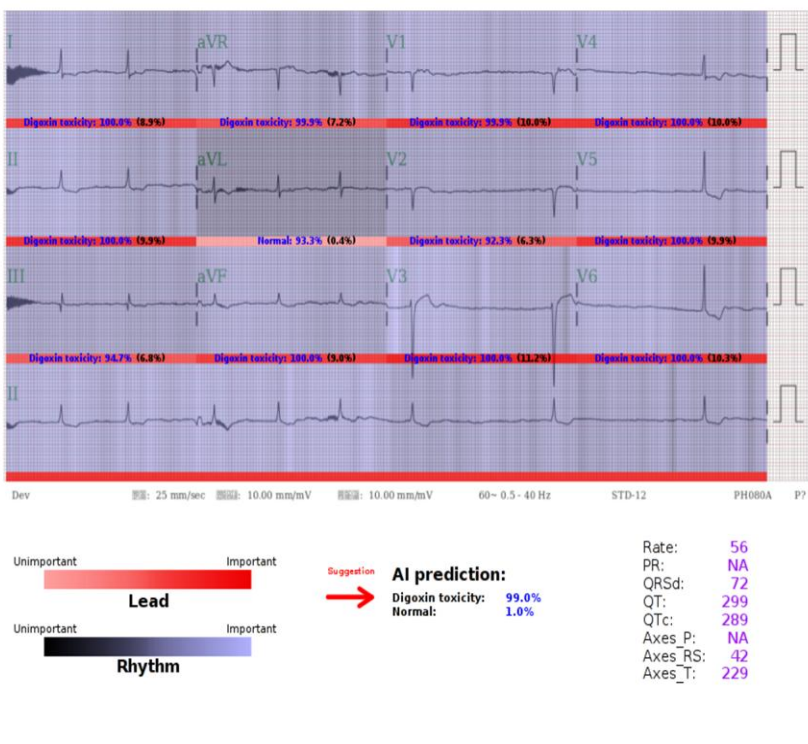
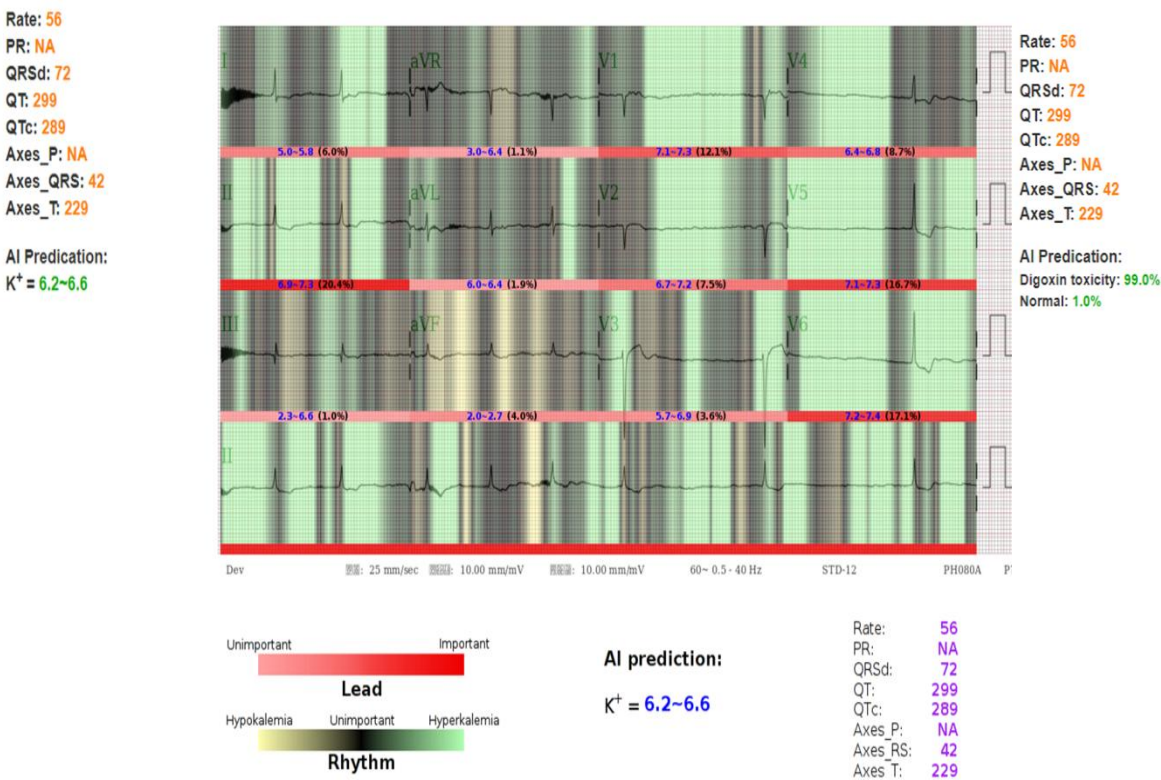


60 mmol  $K^+$  supplement

The ECG-TPP score defined as the similarity of ECG of typical TPP by DLM had the value of probability >50.0% with a sensitivity of 87.5% and a specificity of 69.2%.

- 86-year-old female with intermittent desaturation and bradycardia for about 2 days
- Past history:
  - VHD with moderate to severe MR (LVEF 53%)
  - **Persistent atrial fibrillation with rapid ventricular response, CHA2DS2VASc 5 on digoxin treatment, amiodarone**
  - Type 2 Diabetes mellitus

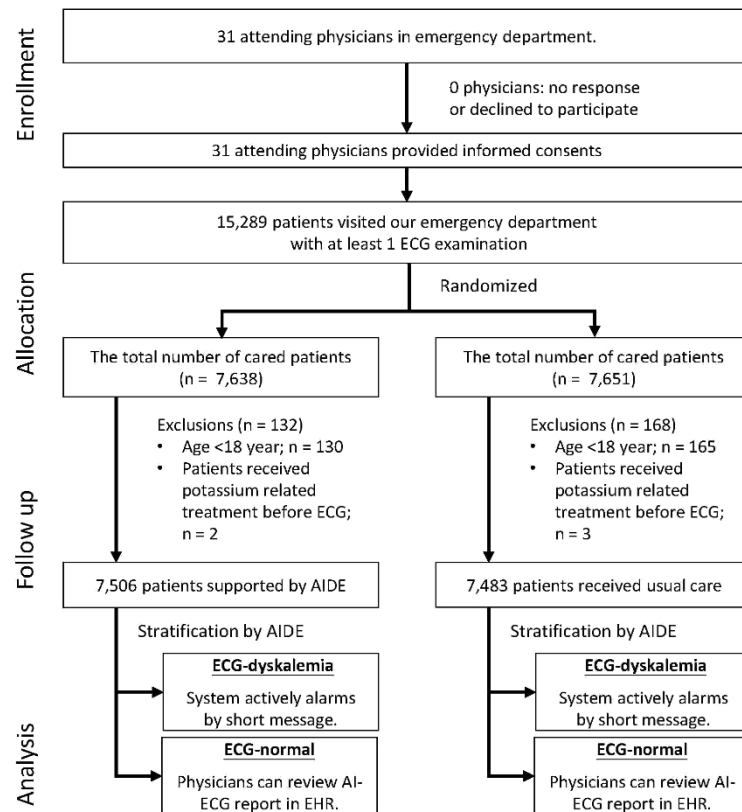
To MER: TPR : 36.8/45/17 BP : 140/64, Sat; 90% on O2 mask



Lab K<sup>+</sup>: 5.9 mmol/L

Serum digoxin level: 4.5 ng/ml

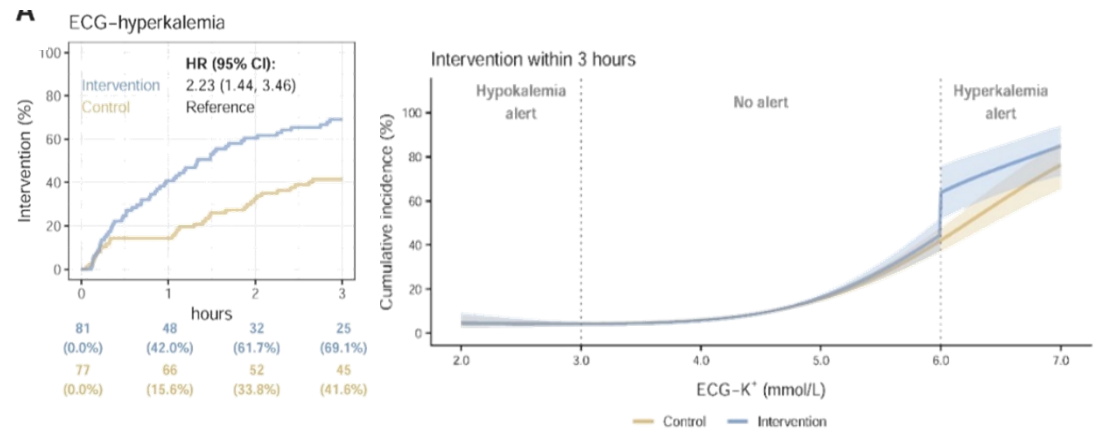
# (V) Artificial Intelligence enabled Dyskalemia using Electrocardiogram (AIDE): a pragmatic randomized controlled trial



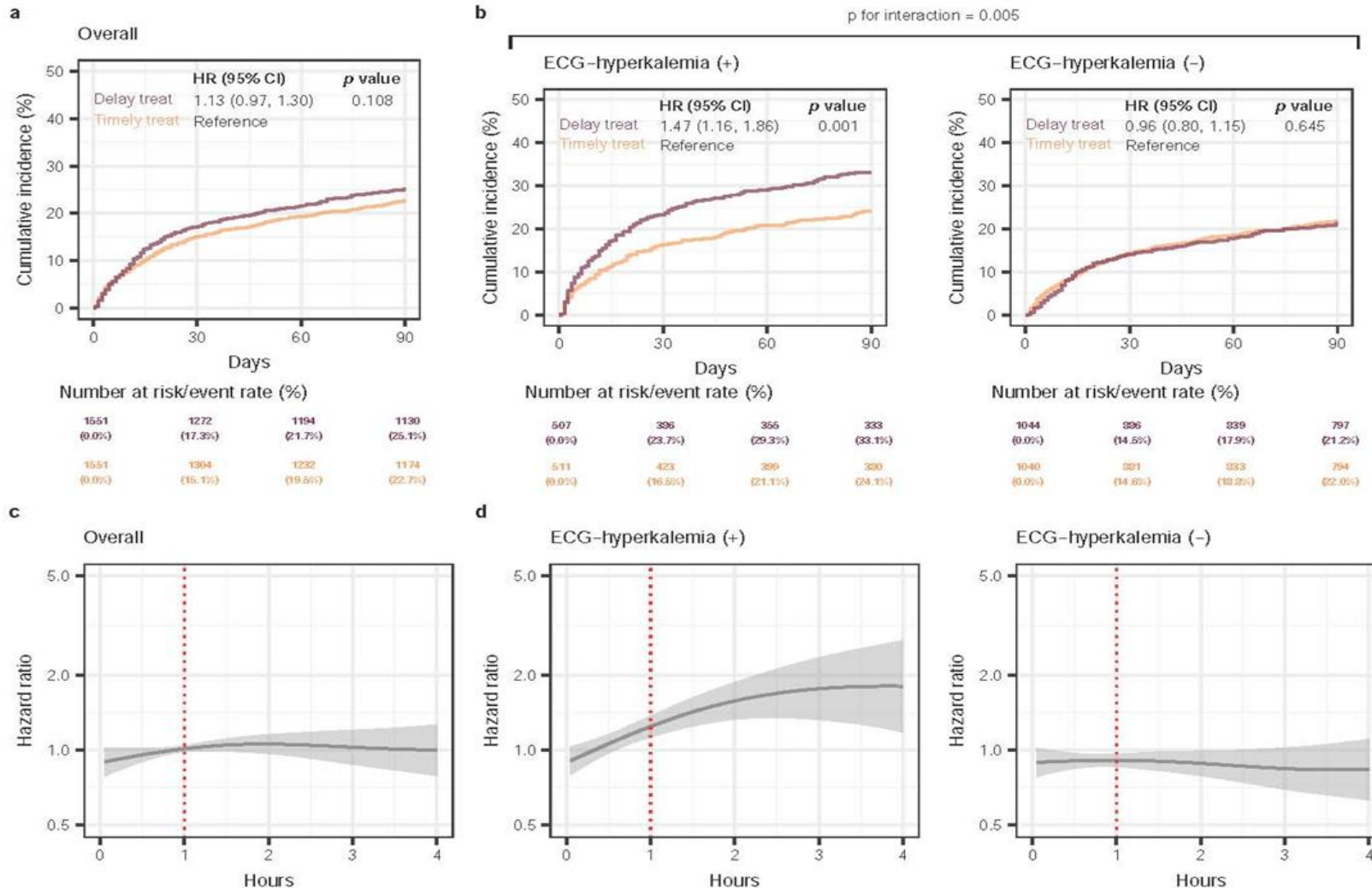
## RCT settings

- Emergency department in TSGH (~6 months)
- AI alert vs. usual care for physicians
- Primary endpoint: early treatment

ClinicalTrial.gov: NCT05118022



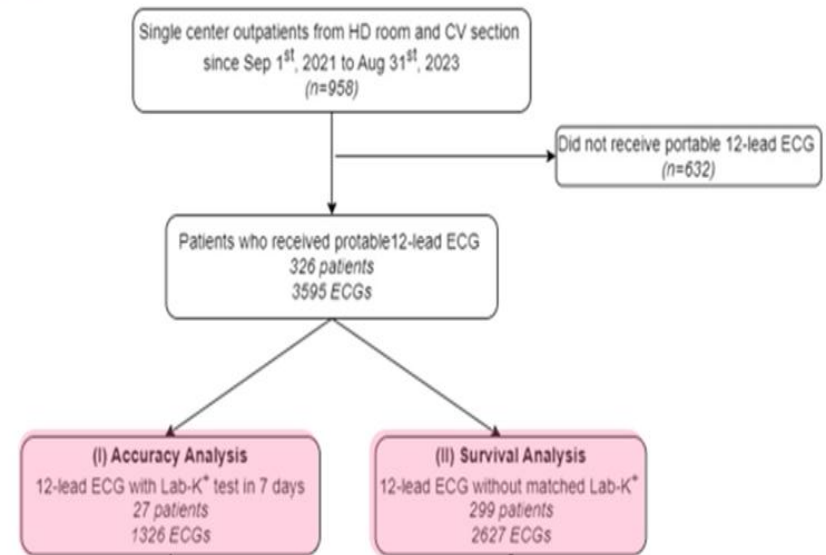
# Timely vs Delayed K<sup>+</sup>-lowering therapy and 90-day mortality events, stratified by AI-ECG hyperkalemia: **A Target Trial Emulation.**



# Artificial Intelligence-enabled Electrocardiography for Predicting Dyskalemia using Home-based ECG Devices



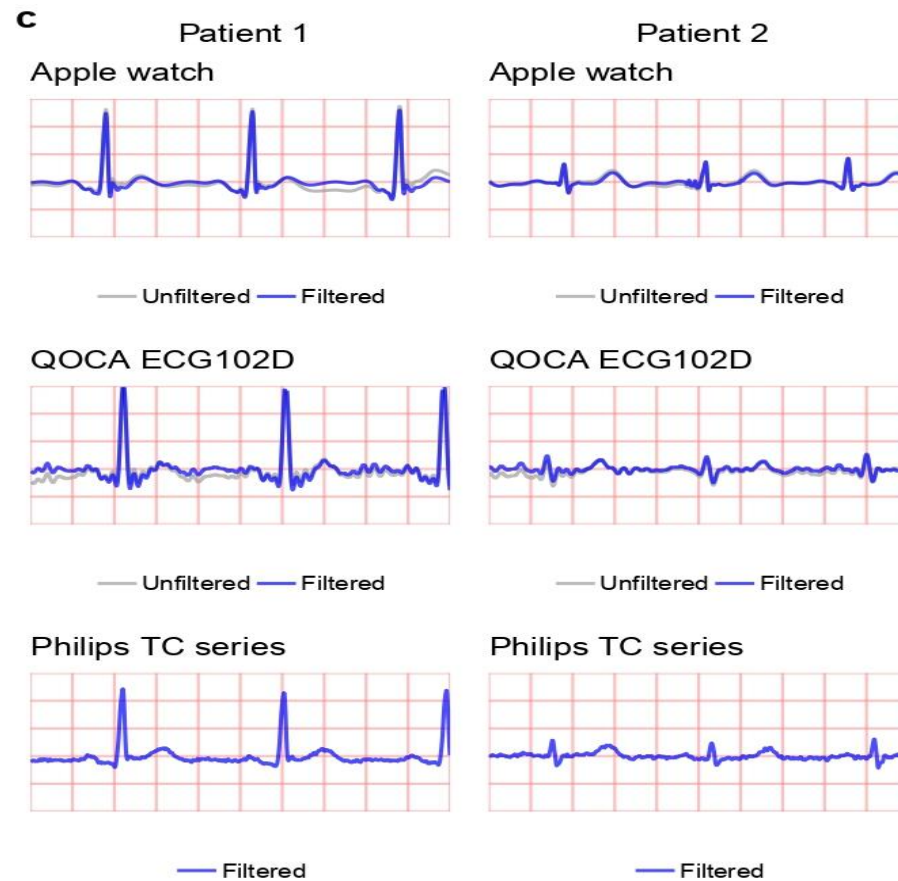
## Methods



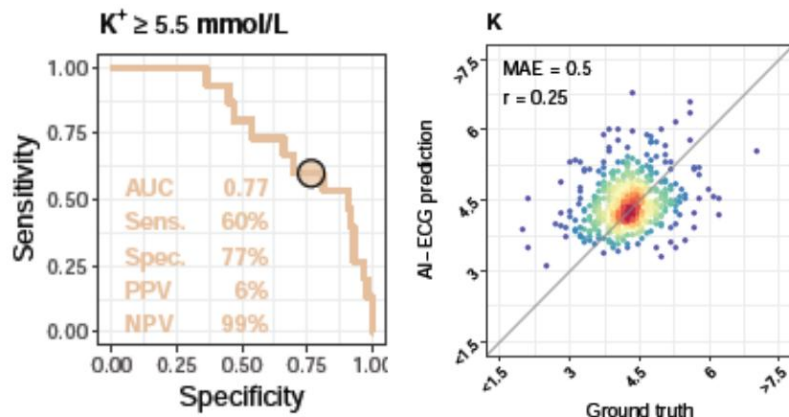
JMIR Med Inform. 2020 Mar; 8(3): e15931  
JAMA Cardiol. 2019 May; 4(5): 428–436

KIDNEY  
WEEK

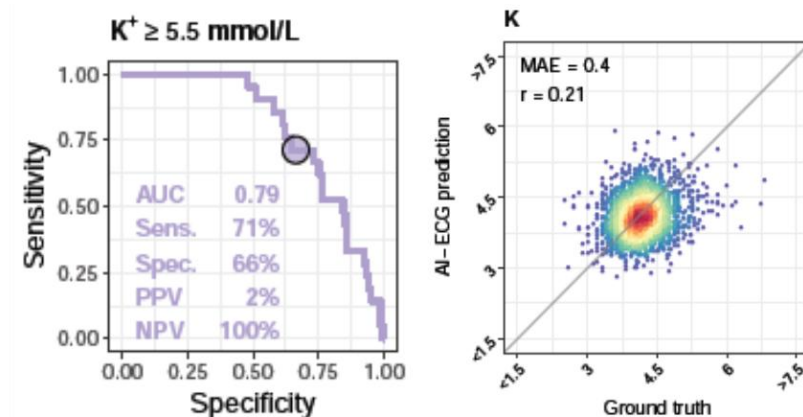
KIDNEY  
WEEK 2024



## Apple Watch



## QOCA ECG102D



# 應用心電圖快速偵測鉀離子異常

Q1

## 與廣達完成技轉(穿戴式裝置)

## 與廣達完成技轉(穿戴式裝置)

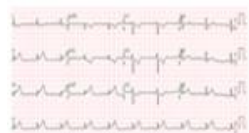
與QT medical/廣達合作，  
採用Philips 12-Lead ECG (PH080A)  
可推廣至各醫學中心



輸入

AI-ECG

輸出



## 美國專利申請

## 獲得美國專利

No. 16/910,035 ; 2020.6.23



所屬專利家族

獲得 77746427

國家/地區

申請案號

TW

TW.109108808.A

US

US.20201691003

## 全台第一



We, 國家新創獎  
New Ideas • New Solutions • New Generations  
Innovators



中華民國專利

中華民國專利證書

發明第 I732489 號

發明名稱：應用心電圖快速偵測鉀離子異常之方法及其系統

專利權人：國防醫學院

發明人：林石化、林錫龍、林振

專利權期限：自2021年7月1日至2040年3月16日止

上開發明係經專利權人依專利法之規定取得專利權

經濟部智慧財產局局長

洪淑敏

中華民國110年7月1日

