

An MLOps Solution Framework for NCKUH: empowering the application of clinical data with technologies

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A Practical Case of MLOps Solution Framework

A practical case

- This is a practical case of this framework for predicting risk of work overtime for nurses.
- The model was built by our nurses through the QOCA[®] aim system.
- Users provide nursing workload data to the inference platform, the model receives data, can output predictions and probabilities, and these results can be returned to a customized dashboard.
- The supervisors can understand who has high risk of work overtime, and make timely work assignments.

班別	單位 屬性	護理師	層級	照護 總床數	是否 延遲下班 機率>50%	延遲 機率	總分	A. 緊急疏散1級	B. 轉運分級1 級	C. 病危註記	D. 手術中/ 恢復室	E. 泛抗藥 性	F. O2 Device: BIPAP/Ventilator	G. 新病 人	H. ICU轉入 (三日內)	I. MEWS>6 分
D	內科	張庭祥	N	7	✓	 76%	1	1	0	0	0	0	0	0	0	0
D	內科	周詩雅	N	6	✓	 84%	3	1	0	0	0	0	0	0	2	0
D	內科	張婉慈	AHN	7	×	 26%	2	1	0	0	0	0	0	0	1	0

Two Components of MLOps Solution Framework

- **Cheng Kung University Hospital Archive of Medical Record Data (CARD) Platform (成大醫院病歷資料整合平台)**
- **QOCA[®] aim system for automated machine learning platform**

The Cheng Kung University Hospital Archive of Medical Record Data (CARD) Platform

Integrate medical records for research purposes

Features of CARD

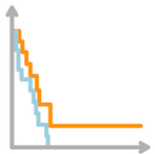
- The features of CARD:



Big data on electronic medical records over a 14-year period (2011 to 2024).



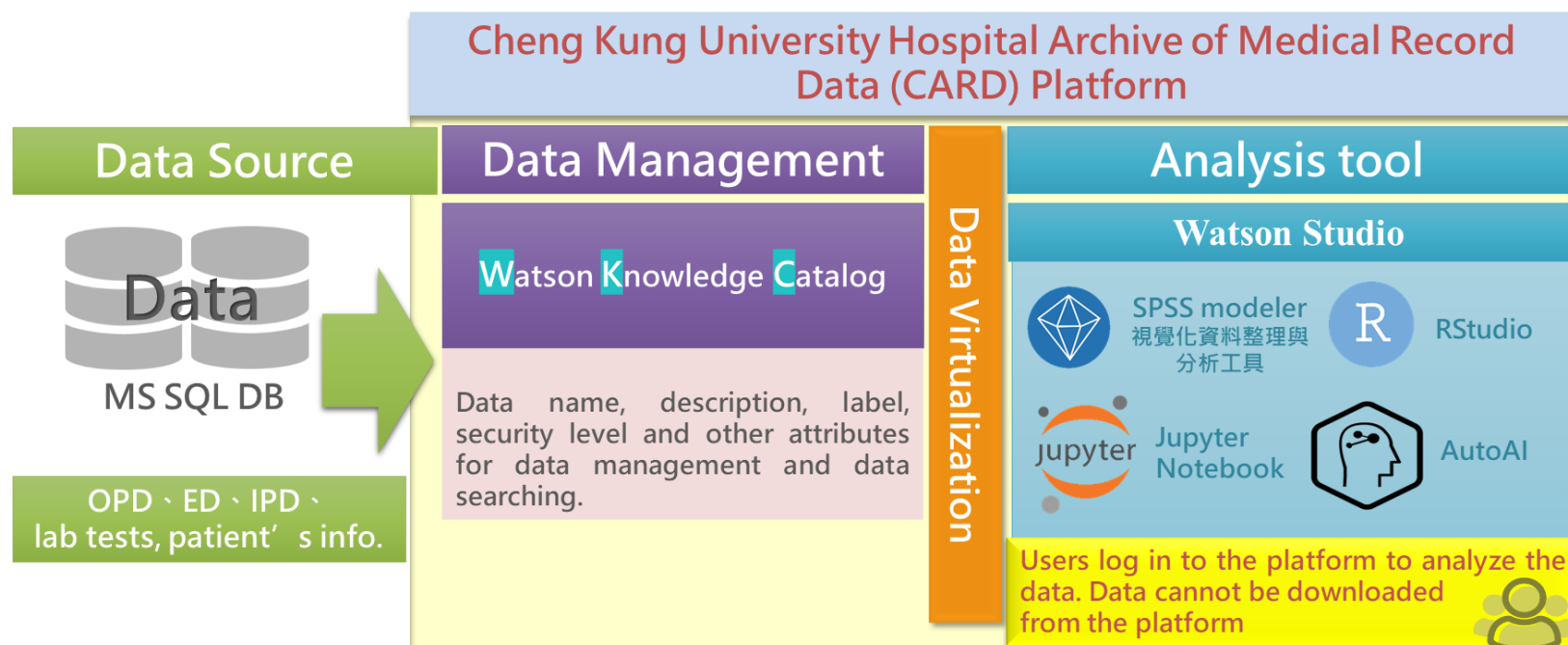
Covers outpatient, emergency, inpatient, lab tests, and other equipment (e.g., DXA, hemodialysis) data.



Integrates Health and Welfare Death Data to provide complete all-cause survival analysis.

Architecture of CARD

- We use **cloud computing platforms** to manage data.
- It adopts **data virtualization** technology to enable users to process and analyze data without copying or moving the raw data.
- Due to personal data protection, data cannot be downloaded from the platform.



Data standardization

- Currently, the CARD is structured as defined by the National Cheng Kung University Hospital. It is customized data structure.
- The future plan is going to convert the CARD into a common data structure, specifically either the Observational Medical Outcomes Partnership (**OMOP**) Common Data Model (CDM) or Fast Healthcare Interoperability Resources (**FHIR**).
- This standardization is intended to facilitate cross-institutional and cross-national research collaboration.

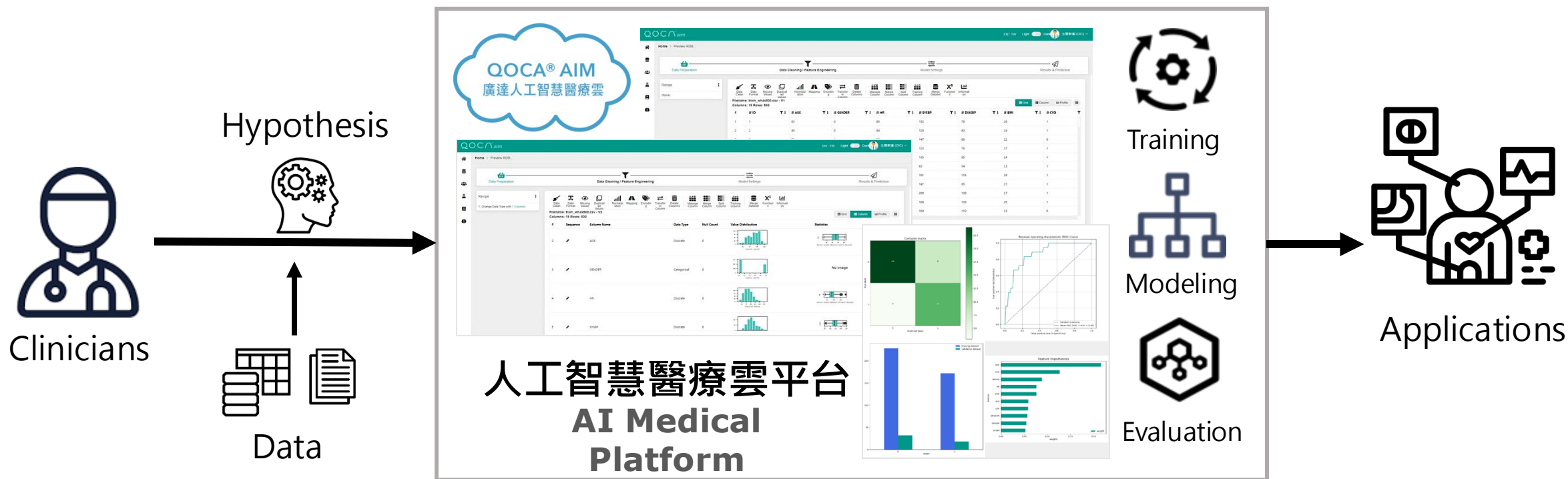
Transformation of Medical Record Database



Quanta for Medical Care AI: AI Medical Platform (QOCA[®] aim)

Quanta for Medical Care AI: AI Medical Platform (QOCA[®] aim)

- QOCA[®] aim is a no-code automated machine learning platform.
- Clinicians can use its graphical user interface (GUI) to build machine learning models by themselves with clicking menus without writing any code.



Quanta for Medical Care AI: AI Medical Platform (QOCA[®] aim)

- GUI for building machine learning models.

Data preprocessing

Toolbar

The toolbar includes icons for Data Clean, Data Format, Missing Values, Duplicated, Normalization, Mapping, Encoding, Transform, Delete Columns, Manage Column, and Merge Column.

Filename: train1.csv - V3
Columns: 15 Rows: 500

#	# age	# gender	# hr	# sysbp
1	83.0	0	68.0	152.0
2	49.0	0	84.0	120.0
3	70.0	1	83.0	147.0
4	70.0	0	78.0	123.0
5	70.0	0	63.0	135.0
6	70.0	0	76.0	83.0
7	57.0	0	73.0	160.0
8	55.0	0	91.0	147.0
9	88.0	1	63.0	209.0
10	54.0	0	104.0	166.0
11	48.0	0	95.0	160.0

Model settings

Pre-Processing Setting

* Validation Method: Train / Validation Split

Data Splitting: 0.80 (Training Data: 400), 0.10 (Validation Data: 50), 0.10 (Test Data: 50)

* Random Seed: 0

Training & testing data

Hyper-Parameter Setting

* Model Name: Decision Tree Classifier

* Max Depth: 10

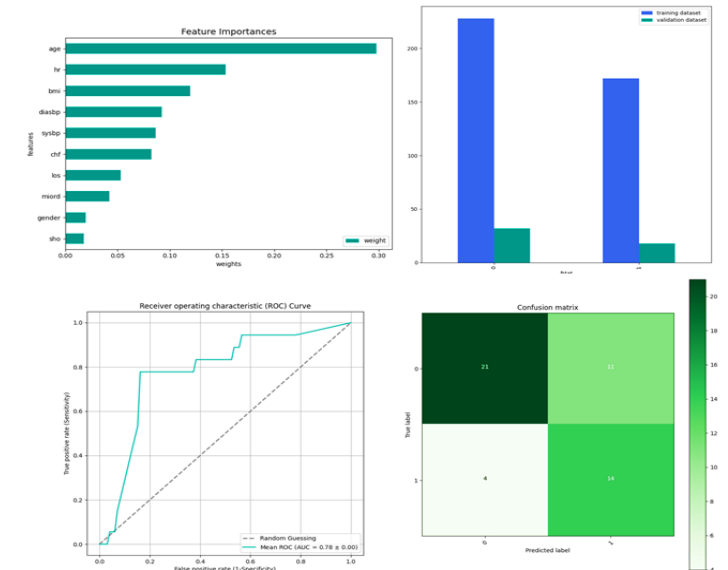
* Min Samples Split: 2

* Min Samples Leaf: 1

* Metrics Index: ☒ Loss ☒ Accuracy ☒ Precision ☒ Recall ☒ F1 Score

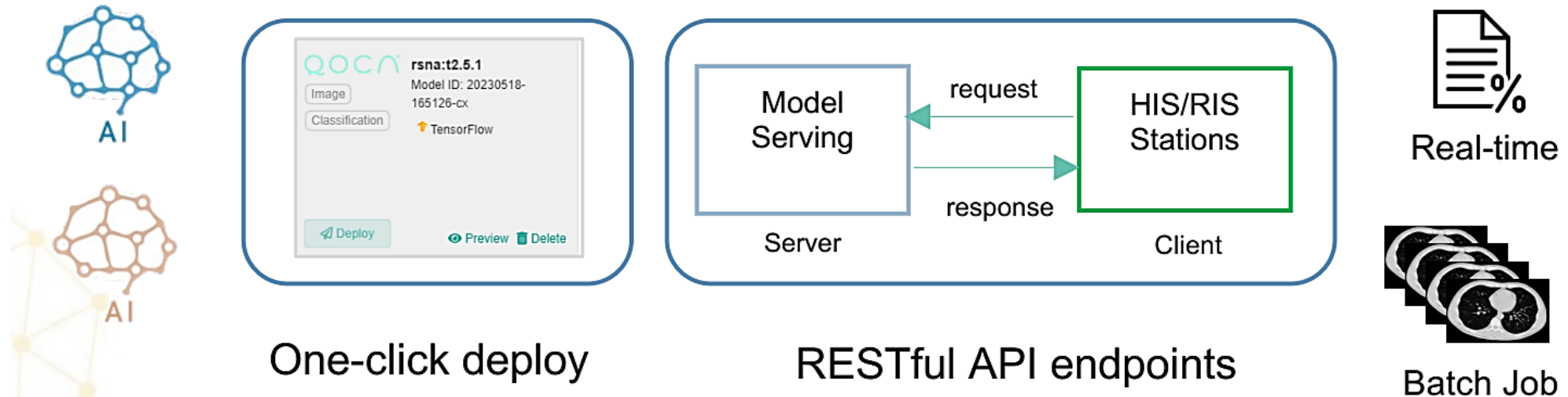
Hyperparameter settings

Model performance



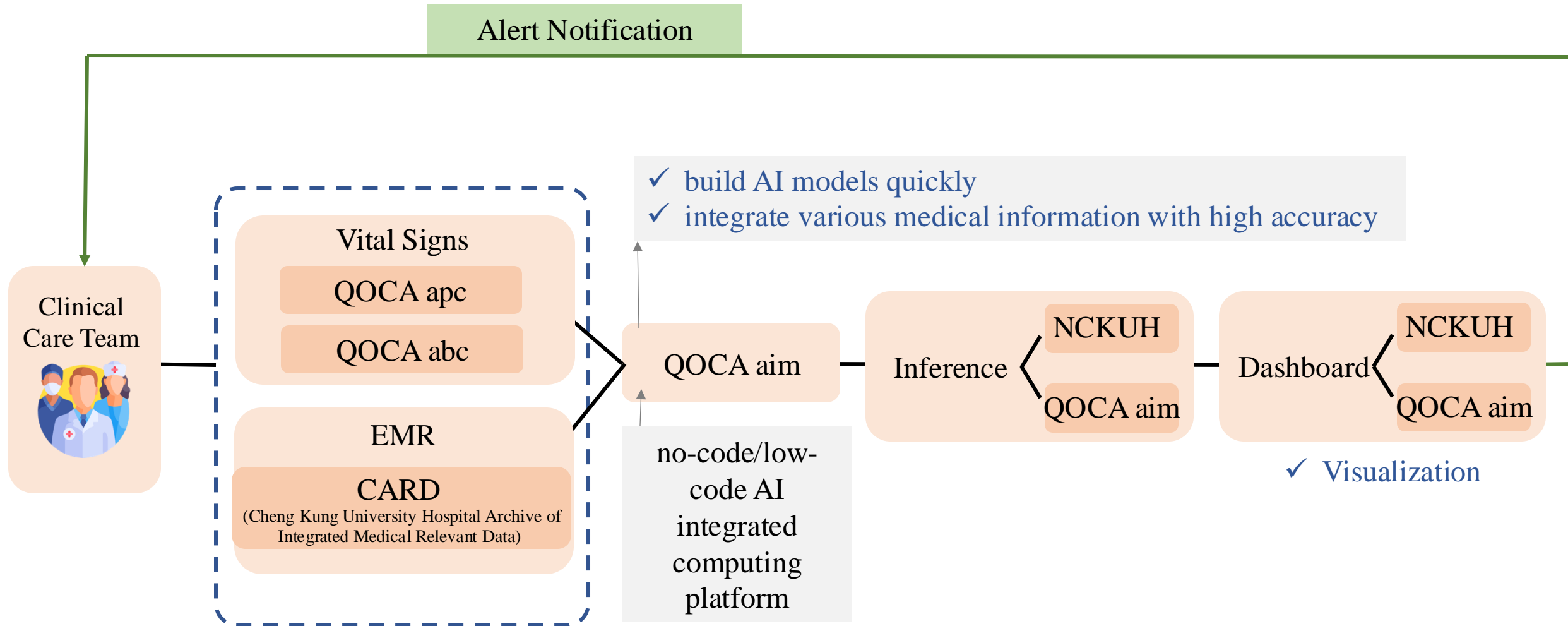
QOCA[®] aim Inference Platform

- An important advantage of this inference platform is **user-friendly design**. Clients can trigger model inference with one click on the platform.
- QOCA[®] aim inference platform supports real-time and batch inference modes.
- Platform centralizes management of all inference tasks.



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Thank you for your attention