

Development of a polygenic risk score to predict recurrence and survival in patients with resected cholangiocarcinoma

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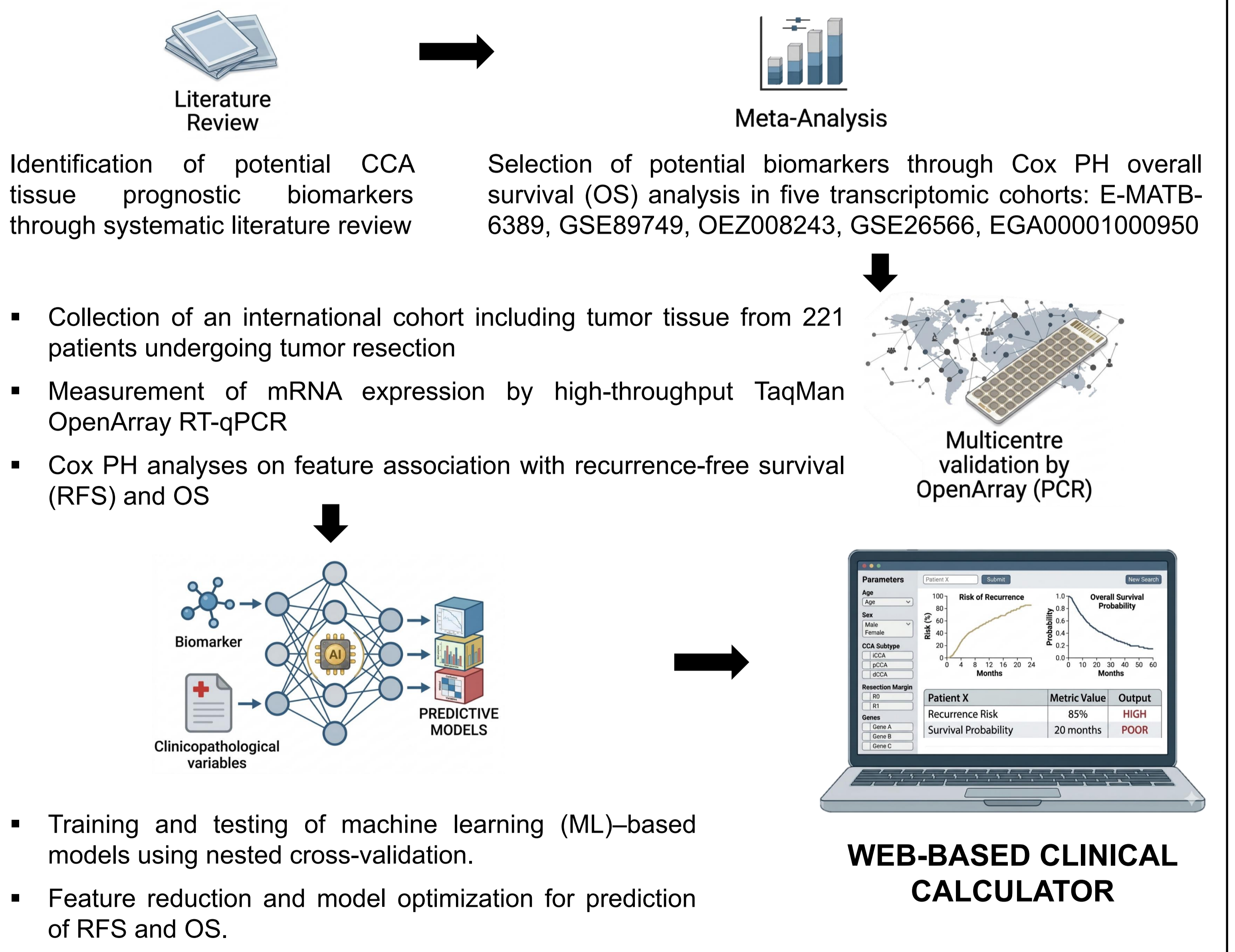
INTRODUCTION

- Cholangiocarcinoma (CCA)** is a rare and aggressive malignancy originating in the bile ducts.
- Potentially curative interventions include surgical resection with negative margins (R0) and liver transplantation.
- However, the likelihood of **post-surgical recurrence remains high**, with 50–70% of patients experiencing recurrence within five years.
- There is an urgent **need for reliable prognostic biomarkers** to guide clinical decision-making and personalize postoperative care.
- Numerous tumor-derived prognostic biomarkers have been proposed, but none have reached clinical application due to limitations such as single-center study designs, small patient cohorts, and semi-quantitative methodologies.

AIM

To identify and validate robust quantitative prognostic biomarkers for CCA by analyzing tumor mRNA expression, integrating them using machine learning, and developing a web-based tool to predict tumor recurrence and overall survival.

METHODS

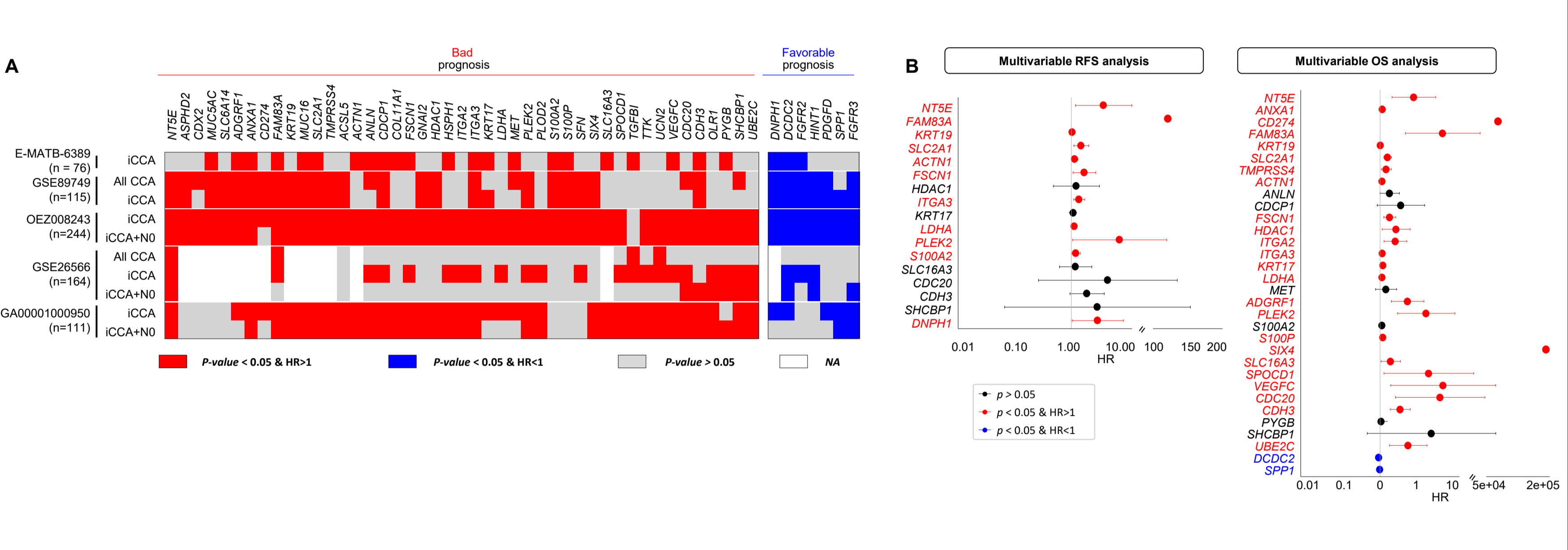


CONCLUSIONS

- We identified and validated a robust panel of prognostic tissue biomarkers in patients with resected CCA.
- Integration of these biomarkers with clinical variables into ML-based prognostic models enabled accurate prediction of RFS and OS.
- The resulting web-based tool allows clinicians to input RT-qPCR results for the validated biomarkers and obtain precise, individualized prognostic predictions for postoperative recurrence and survival.

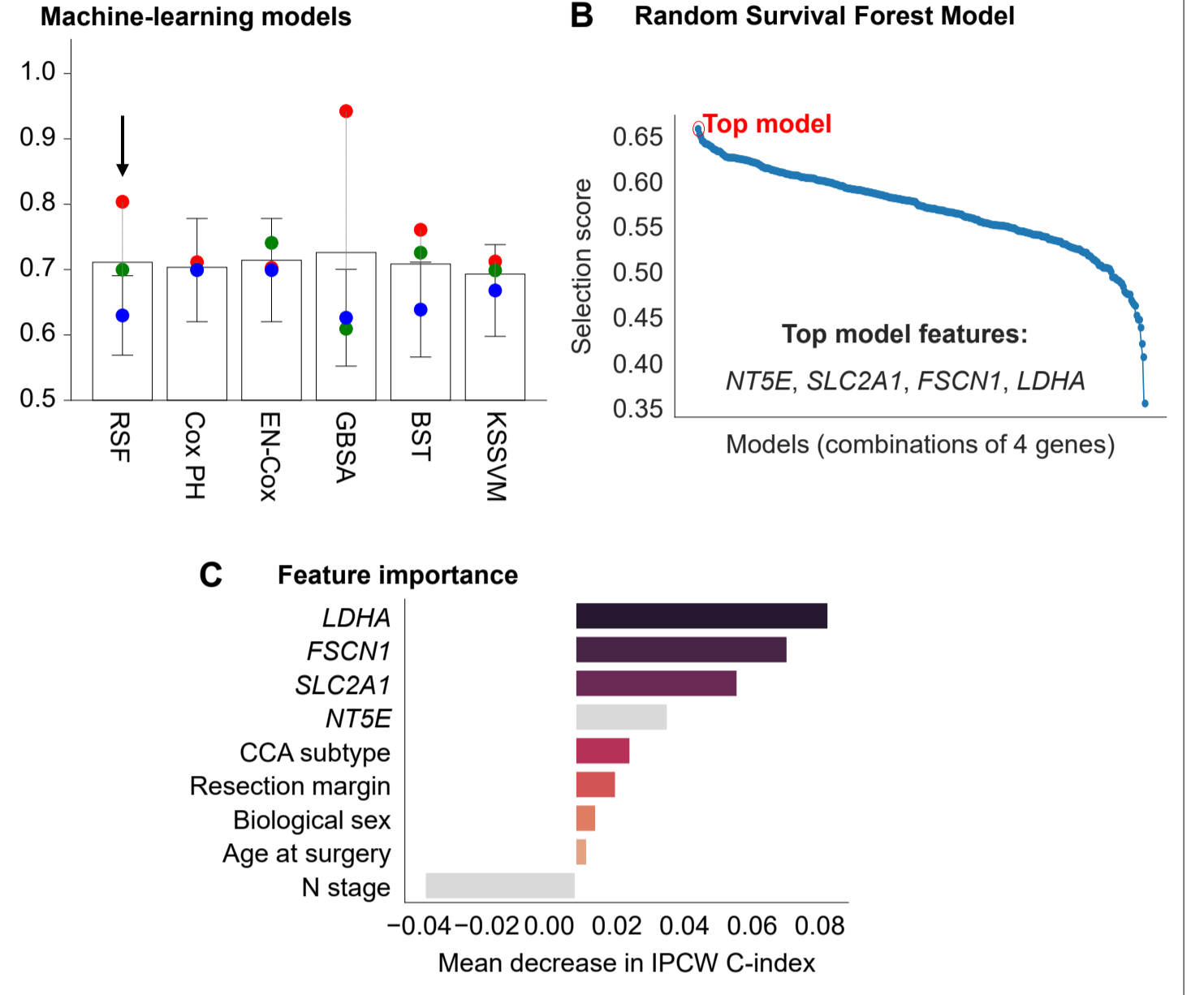
RESULTS

Figure 1. Identification of prognostic tumor biomarkers by meta-analysis and validation in an international CCA cohort using OpenArray RT-qPCR



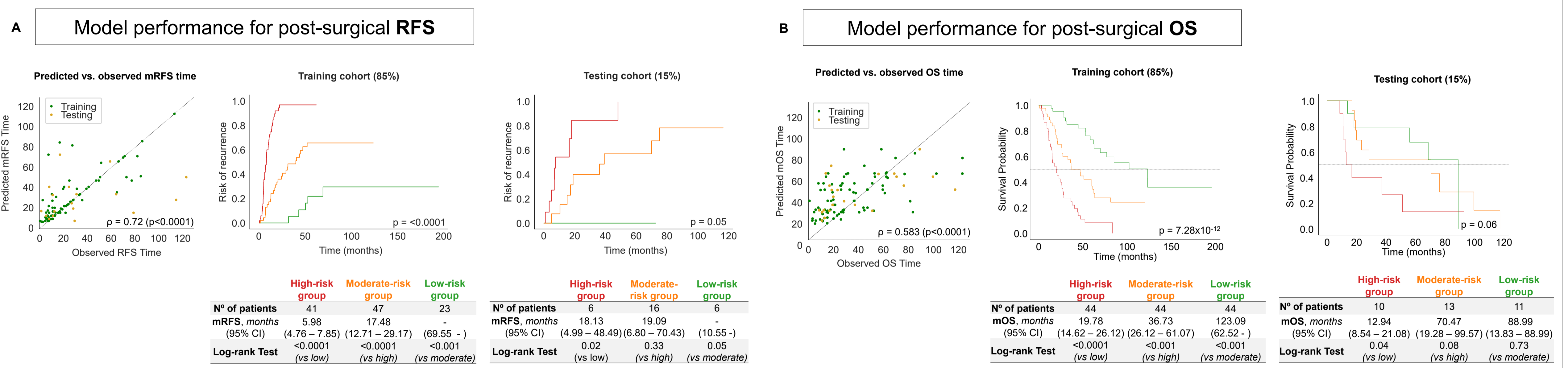
(A) Heatmap summarizing 52 prognostic biomarkers across analysis groups: 45 associated with poor prognosis (red) and 7 with favorable prognosis (blue). Genes are classified according to hazard ratio direction (HR > 1, poor prognosis; HR < 1, favorable prognosis) and statistical significance (p < 0.05). (B) Forest plots of multivariable Cox proportional hazards analyses for the 17 genes identified as significantly associated with prognosis in univariable analyses for RFS (left) and OS (right). Models were adjusted for clinicopathological covariates, including resection margin status, lymph node involvement, T stage, CCA subtype, and center of origin. Eleven genes retained independent prognostic significance.

Figure 2. Development and evaluation of ML-based predictive models for RFS



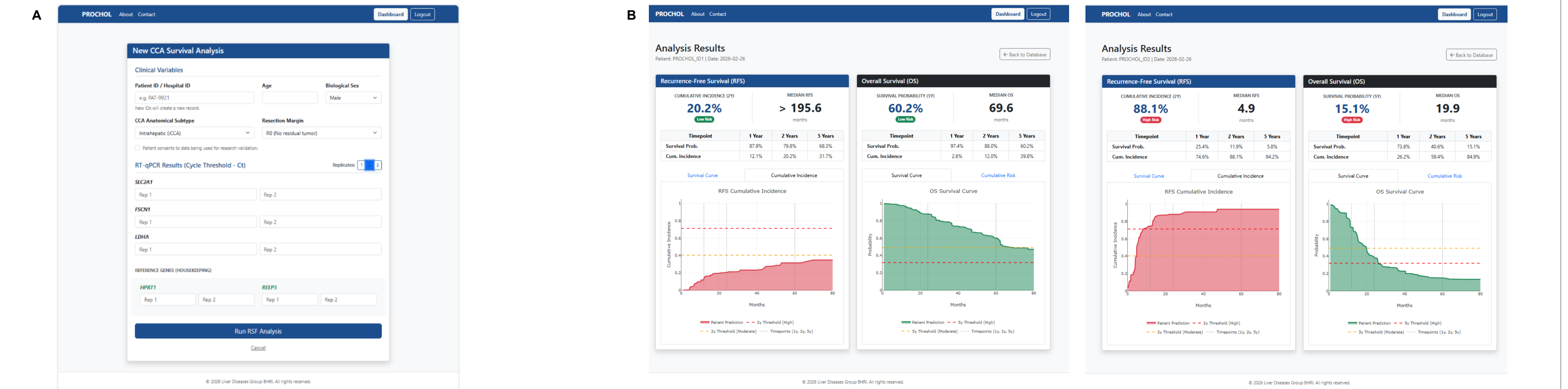
(A) IPCW C-index of six ML-based RFS models under nested CV, training, and testing cohorts. (B) IPCW C-index-based selection of Random Survival Forest (RSF) models across all 4 gene-combinations selected from 11 RFS prognostic genes. (C) Feature importance of the final RSF model (NT5E, SLC2A1, FSCN1, LDHA + clinical variables).

Figure 3. Performance of predictive models integrating three genes (LDHA, FSCN1, and SLC2A1) and four clinical variables (CCA subtype, resection margin, sex, and age at surgery) for RFS and OS



Model performance for post-surgical RFS (A) and OS (B) prediction. Median predicted versus observed survival time in uncensored patients (left panels). Cumulative incidence curves for recurrence (RFS) and survival (OS) stratified into high- (red), moderate- (yellow), and low-risk (green) groups in the training (middle panels) and testing (right panels) cohorts.

Figure 4. Overview of the PROCHOL web-based clinical calculator for predicting RFS and OS after surgical resection

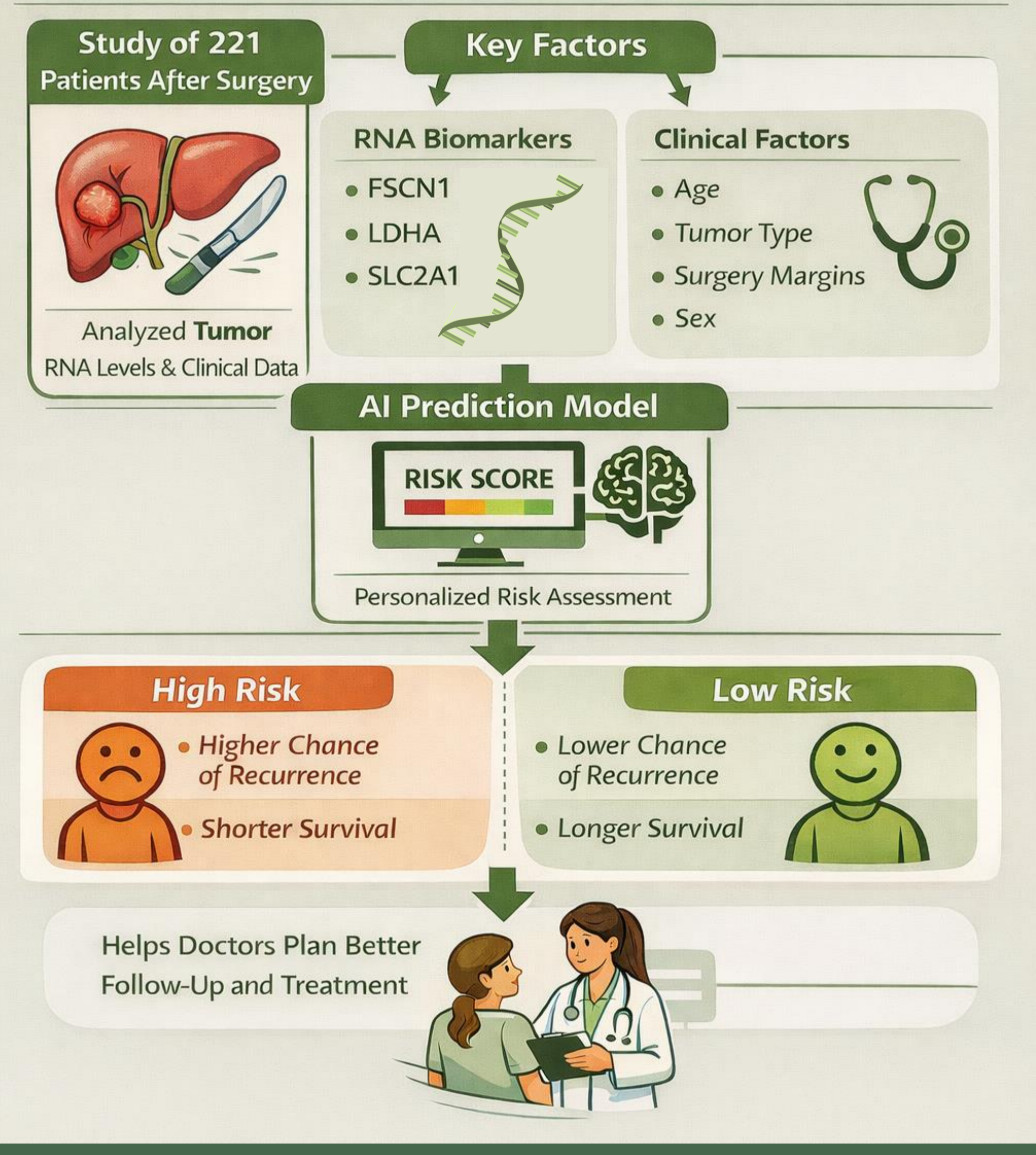


(A) Data entry interface for clinical variables—age, sex, CCA subtype, and resection margin—alongside RT-qPCR cycle threshold (Ct) values for the three-gene signature (SLC2A1, FSCN1, LDHA) and housekeeping reference genes (HPRT1, REEP5). (B) Examples of patient-level visual reports estimating individual recurrence risk and predicted survival.

PATIENT-FRIENDLY SUMMARY

Predicting Recurrence and Survival in Cholangiocarcinoma

Researchers developed a new genetic test to help predict if bile duct cancer (cholangiocarcinoma) will come back after surgery and how long a patient might live.



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