Immunotherapy Toxicities

802 AN ELECTRONIC HEALTH RECORD-BASED APPROACH TO IDENTIFY AND CHARACTERIZE PATIENTS WITH IMMUNE CHECKPOINT INHIBITOR-ASSOCIATED ARTHRITIS

Steven Tran*, Luke Rasmussen, Jennifer Pacheco, Carlos Galvez, Kyle Tegtmeyer, Yuan Luo, Jeffrey Sosman, Abel Kho, Theresa Walunas. *Northwestern University Feinberg School of Medicine, Chicago, IL, United States*

Background Immune checkpoint inhibitors (ICIs) are a pillar of cancer therapy with demonstrated efficacy in a variety of malignancies. However, they are associated with immune-related adverse events (irAEs) that affect many organ systems with varying severity, inhibiting patient quality of life and in some cases the ability to continue immunotherapy. Research into irAEs is nascent, and identifying patients with adverse events poses a critical challenge for future research efforts and patient care. This study's objective was to develop an electronic health record (EHR)-based model to identify and characterize patients with ICI-associated arthritis (checkpoint arthritis).

Methods Forty-two patients with checkpoint arthritis were chart abstracted from a cohort of all patients who received checkpoint therapy for cancer (n=2,612) in a single-center retrospective study. All EHR clinical codes (N=32,198) were extracted including International Classification of Diseases (ICD)-9 and ICD-10, Logical Observation Identifiers Names and Codes (LOINC), RxNorm, and Current Procedural Terminology (CPT). Logistic regression, random forest, gradient boosting, support vector machine, K-nearest neighbors, and neural network machine learning models were trained to identify checkpoint arthritis patients using these clinical codes. Models were evaluated using receiver operating characteristic area under the curve (ROC-AUC), and the most important variables were determined from the logistic regression model. Models were retrained on smaller fractions of the important variables to determine the minimum variable set necessary to achieve accurate identification of checkpoint arthritis.

Results Logistic regression and random forest were the highest performing models on the full variable set of 32,198 clinical codes (AUCs: 0.911, 0.894, respectively) (table 1). Retraining the models on smaller fractions of the most important variables demonstrated peak performance using the top 31 clinical codes, or 0.1% of the total variables (figure 1). The most important features included presence of ESR, CRP, rheumatoid factor lab, prednisone, joint pain, creatine kinase lab, thyroid labs, and immunization, all positively associated with checkpoint arthritis (figure 2).

Abstract 802 Table 1 Model performance metrics

Model	AUC	Sensitivity	Specificity	PPV	NPV
Logistic Regression	0.911	0.238	0.999	0.833	0.988
Random Forest	0.894	0.286	0.999	0.857	0.988
Gradient Boosting	0.826	0.571	0.982	0.343	0.993
Support Vector Machine	0.566	1.000	0.132	0.018	1.000
K-Nearest Neighbor	0.497	0.000	0.995	0.000	0.984
Neural Network	0.763	0.000	0.999	0.000	0.984
SVM Anomaly Detection	0.589	0.000	0.953	0.000	0.983

AUC was calculated from the ROC curve. Sensitivity, specificity, PPV, and NPV were determined at the threshold maximizing the F1-score. AUC = area under the curve, ROC = receiver operating characteristic, PPV = positive predictive value, NPV = negative predictive value

Abstract 802 Figure 1 Model AUC trained on decreasing fractions of the most important variables, determined by the random forest model. 100% = 32,198 clinical codes. LReg = logistic regression, RF = random forest, GB = gradient boosting, NN = neural network, KNN = K-nearest neighbor, SVM = support vector machine, SVMAnom = SVM anomaly detection

Abstract 802 Figure 2 The 31 most important variables determined by the logistic regression (A, coefficients) and random forest (B, relative importance) models

Conclusions Our study demonstrates that a data-driven, EHR based approach can robustly identify checkpoint arthritis patients. The high performance of the models using only the 0.1% most important variables suggests that only a small number of clinical attributes are needed to identify these patients. The variables most important for identifying checkpoint arthritis included several unexpected clinical features, such as thyroid labs and immunization, indicating potential underlying irAE associations that warrant further exploration. Finally, the flexibility of this approach and its demonstrated effectiveness can be applied to identify and characterize other irAEs.

Ethics Approval This study was approved by the Northwestern University Institutional Review Board, ID STU00210502, with a granted waiver of consent

<http://dx.doi.org/10.1136/jitc-2021-SITC2021.802>