

MACHINE LEARNING MODELING TO SUPPORT CARDIO-ONCOLOGY MEDICAL PRACTICE

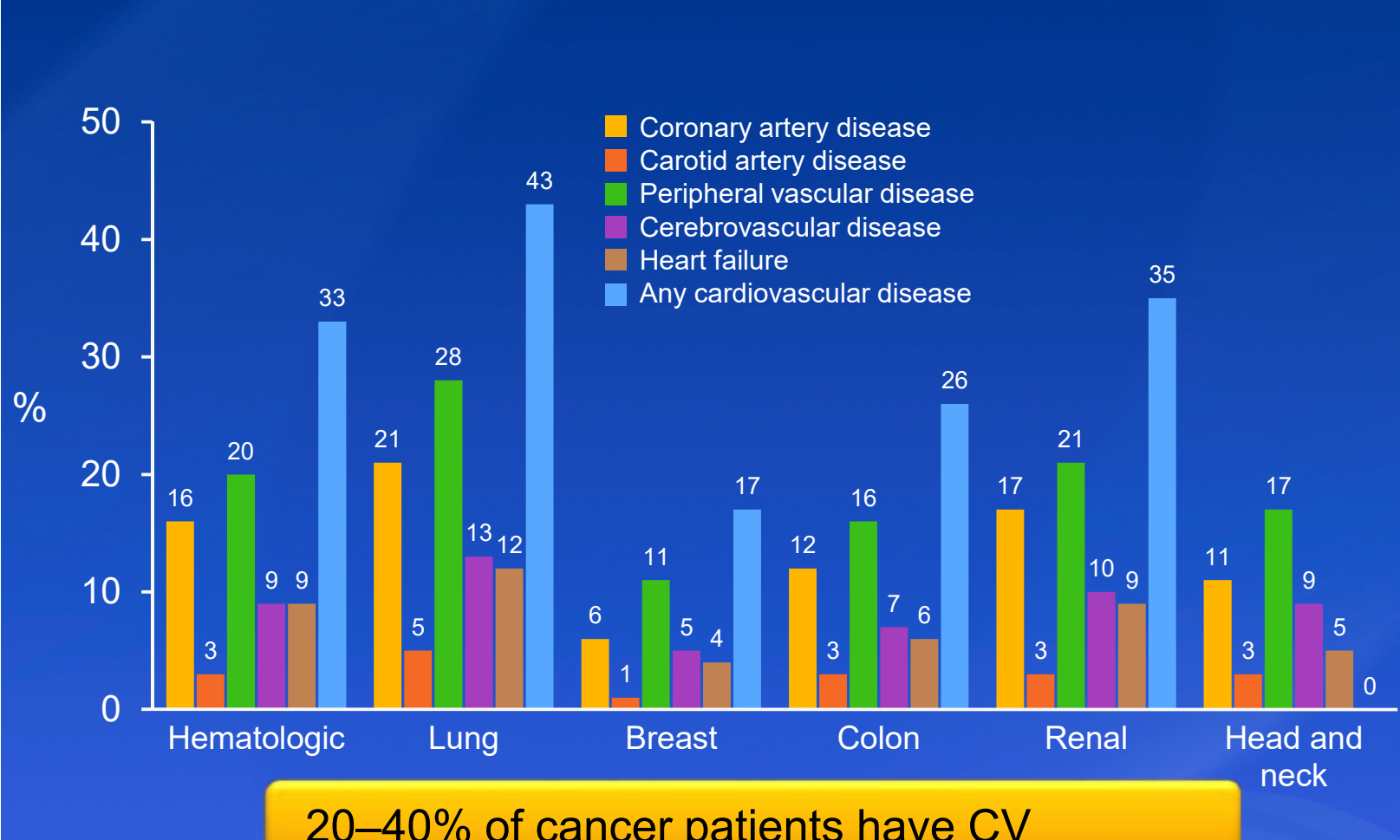
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What is Cardio-oncology?

- New cardiology subspecialty focused on preventive and acute treatment of cardiovascular side effects associated with toxicity from chemotherapy, radiology, and immunotherapy.
- 2nd most prevalent cause of death among oncology patients, less common than only the primary cancer diagnosis itself

Prevalence of CVD in Cancer Patients



20-40% of cancer patients have CV

Goal

- Calculate risk scores to identify and refer patients who are susceptible to cardiotoxicity to oncologists.
- Standardize recommendations among oncologists and cardio-oncologists by incorporating risk scores within the EHR as best practice alerts or timely reports which leads to more equitable patient care.

METHODS AND RESULTS

Cohort	Treatment	Risk Scores	Model Training and Evaluation	Algorithms and Outcomes
Breast Cancer	Doxorubicin, Bevacizumab...etc.	<ul style="list-style-type: none"> • Diabetes • Cholesterol • Ejection Fraction • A1C • BMI • Smoking • Race • BNP Levels • Coronary Artery Disease • ...etc. 		<ul style="list-style-type: none"> • Random Forest and artificial neural network models were trained. • Multiclass predictive scores of Major, Moderate, Low and Potential were generated. • Research study models performance exceeded 92% on accuracy and 90% on AUC.
B-cell Lymphoma	Acalabrutinib, Cisplatin...etc.			
Renal Cancer	Everolimus, Sorafenib...etc.			
Immunotherapy (limited to melanoma, lung cancer and kidney cancer patients)	Nivolumab, Pembrolizumab...etc.			

Conclusion

Predictive models are ready for translation into oncology practice to identify and care for patients who are at high risk of cardiotoxicity. Limited validation identified 86% of the lymphoma and 58% of the renal cancer patients with “Major” risk for cardiotoxicity who were not referred to cardio-oncology. A renal cancer pilot project is underway to integrate model predictions with Epic workflows by leveraging data in the VUMC Data Lake (Microsoft Azure) along with cloud compute in the Azure Databricks (Spark) platform.