

Artificial Pathologists

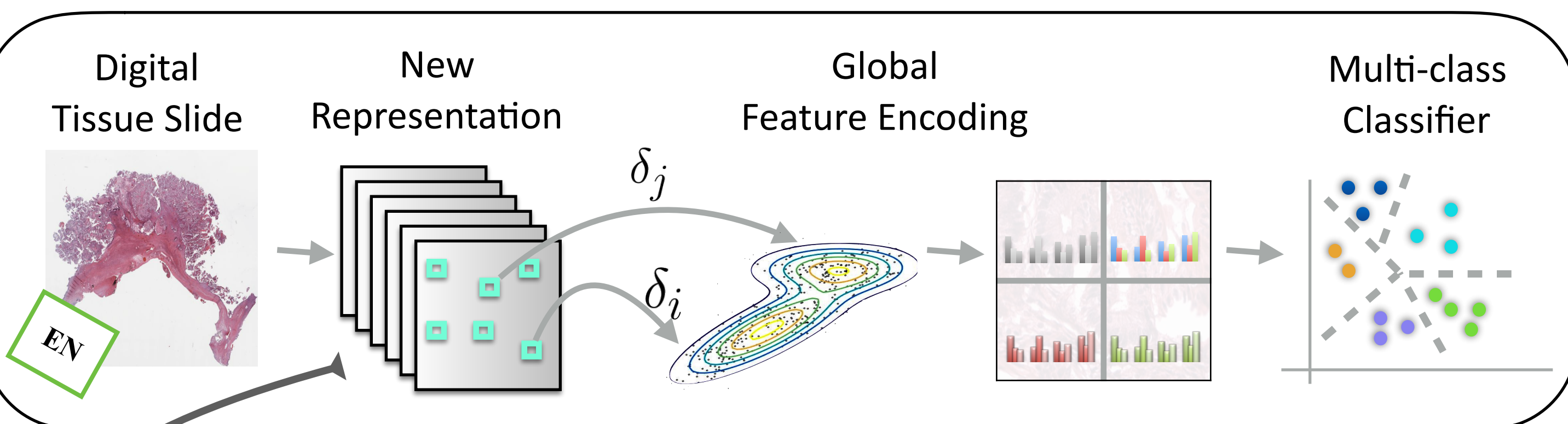
Machine Learning Models for Histopathology

Aïcha BenTaieb and Ghassan Hamarneh
In Collaboration With: Hector Li-Chang and David Huntsman

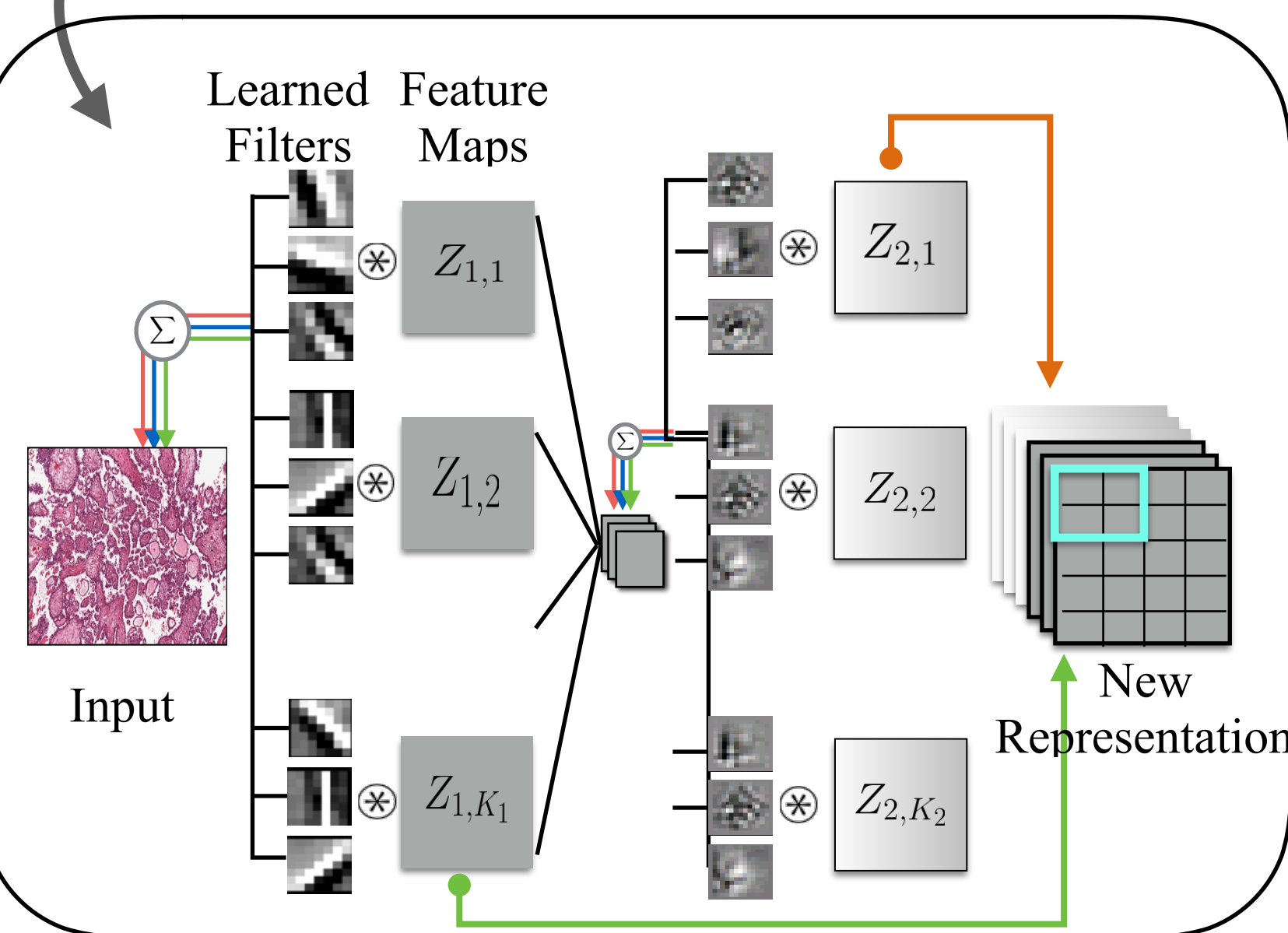
1. Quick Facts on Ovarian Cancers (OC)

- ~300 women are diagnosed¹ with OC each year in BC
- ~250 women die¹ from OC each year in the province
- In 2009, 5 subtypes² of OC have been identified
- In 2016, 2 new genetic subtypes² have been identified
- Accurately identifying OC from tumour biopsies is critical for a successful diagnosis and prognosis

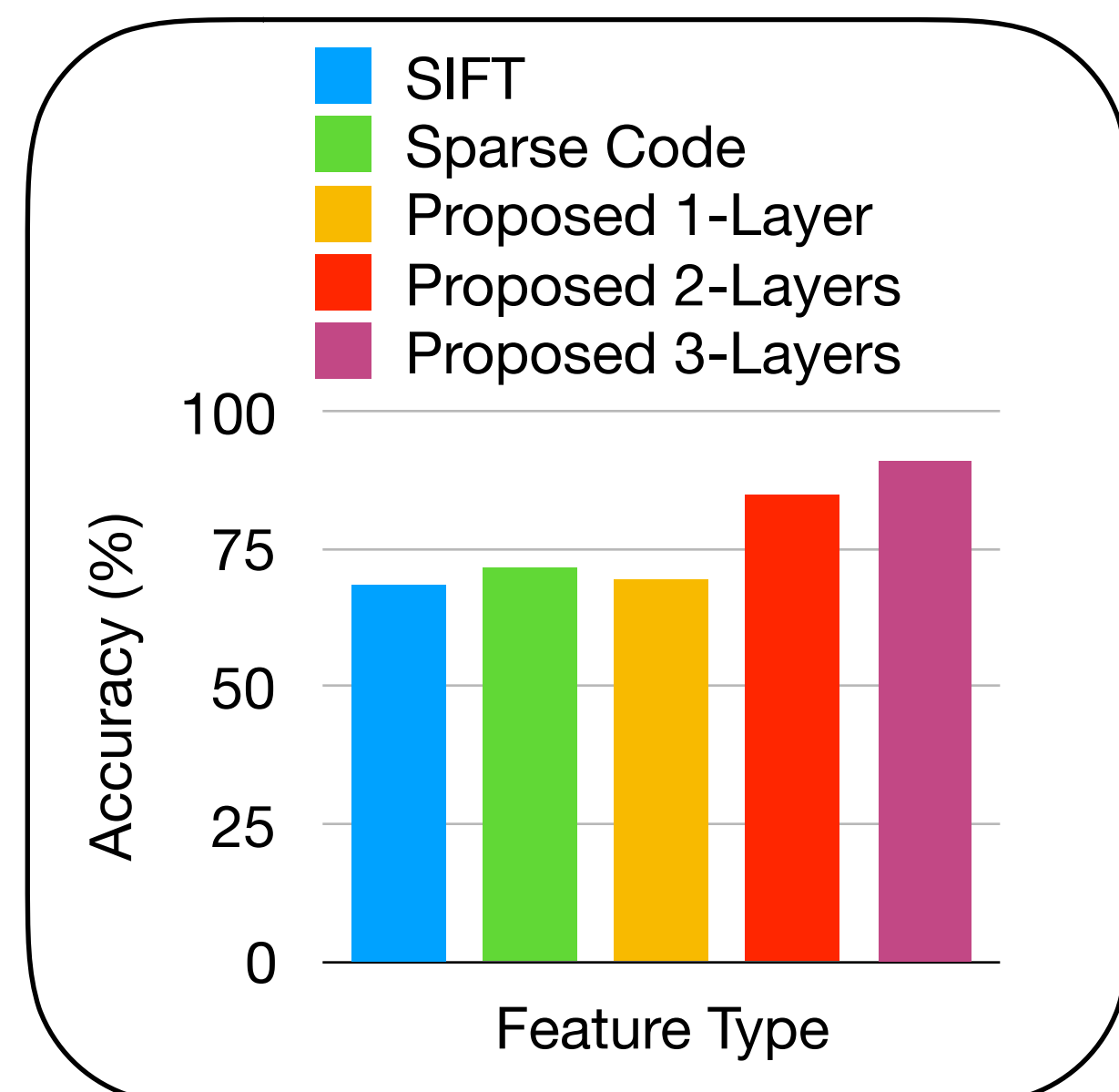
3. Learning Features Discriminative of Cancers



Automatic Feature Learning Pipeline⁴



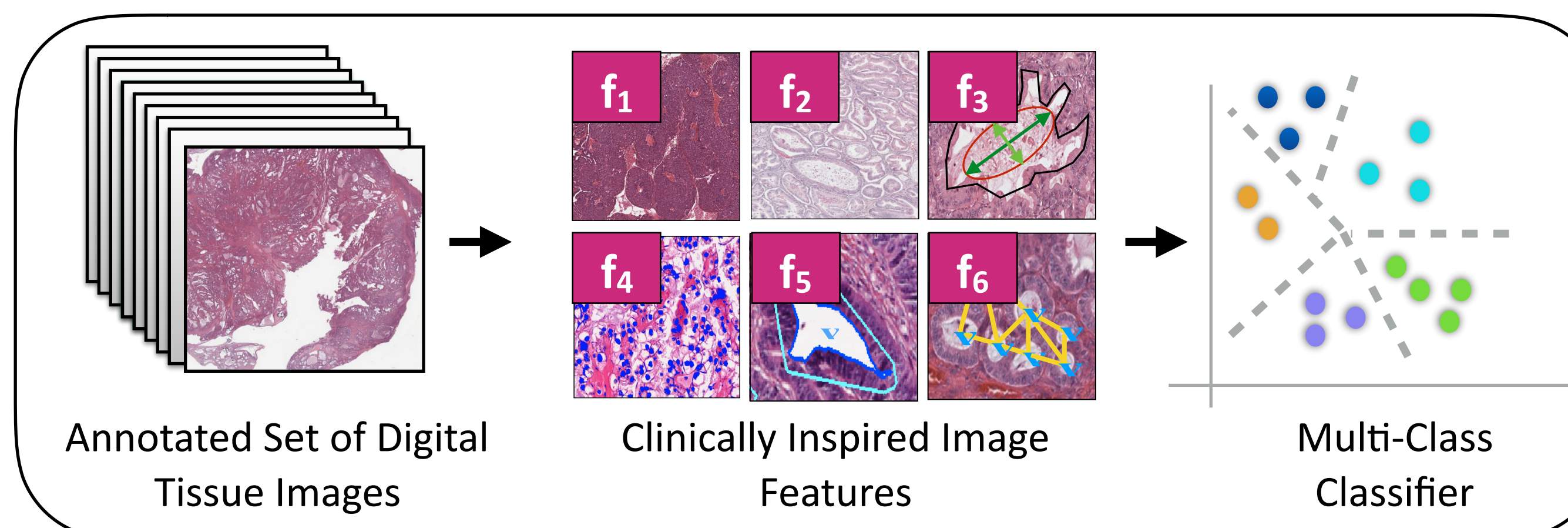
Learning Features with a 2-Layer Deconvolution Network



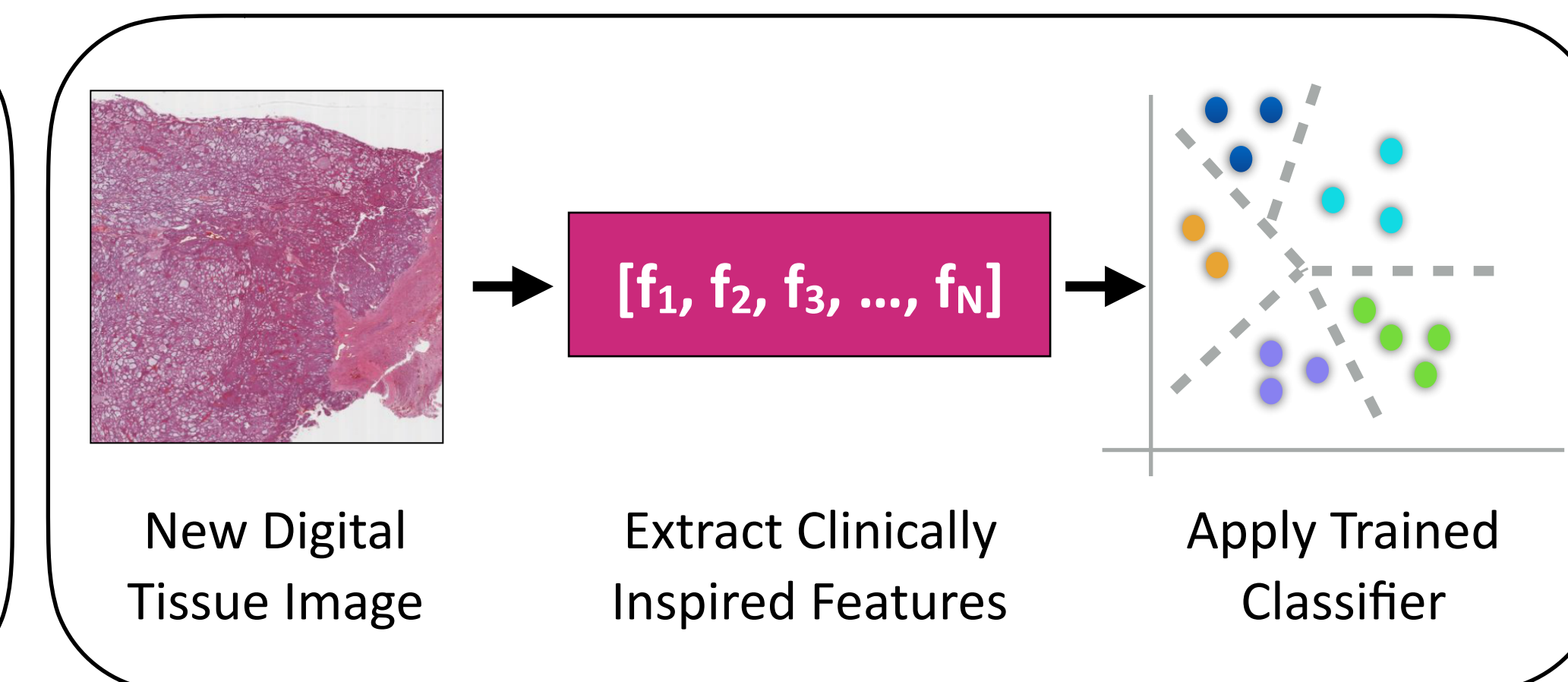
Validation on 80 Patients from different pathology centres

- ✓ Identifies discriminative features directly from tissues
- ✓ Generalizes well to tissue images from different centers
- ✓ Black-box architecture, unintuitive to analyze

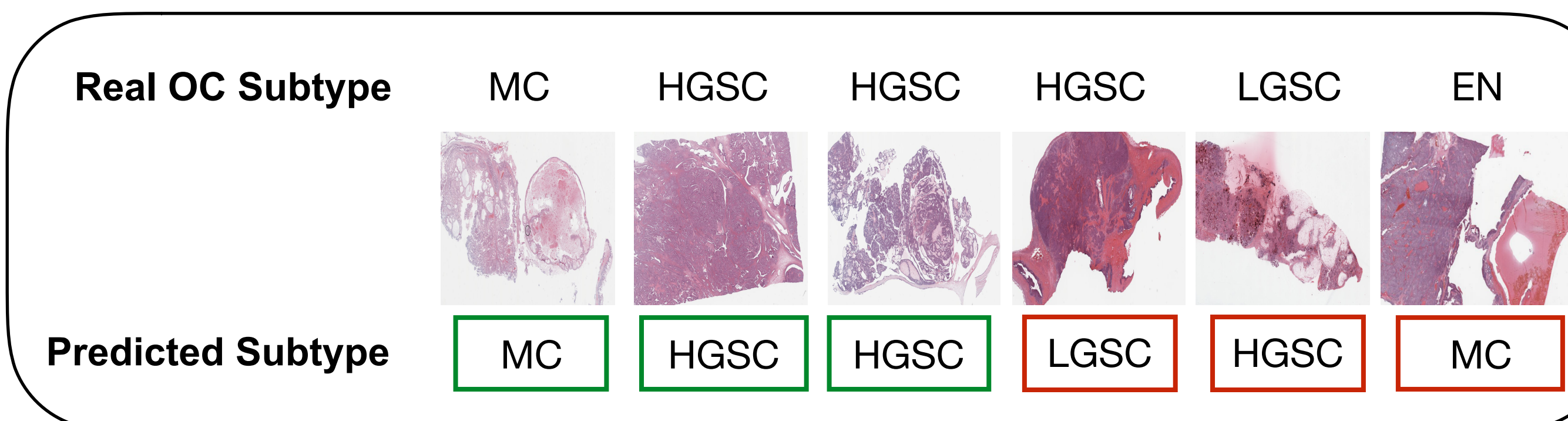
2. Teaching Computers to Mimic Pathologists



Automatic OC Diagnosis System Training Pipeline³



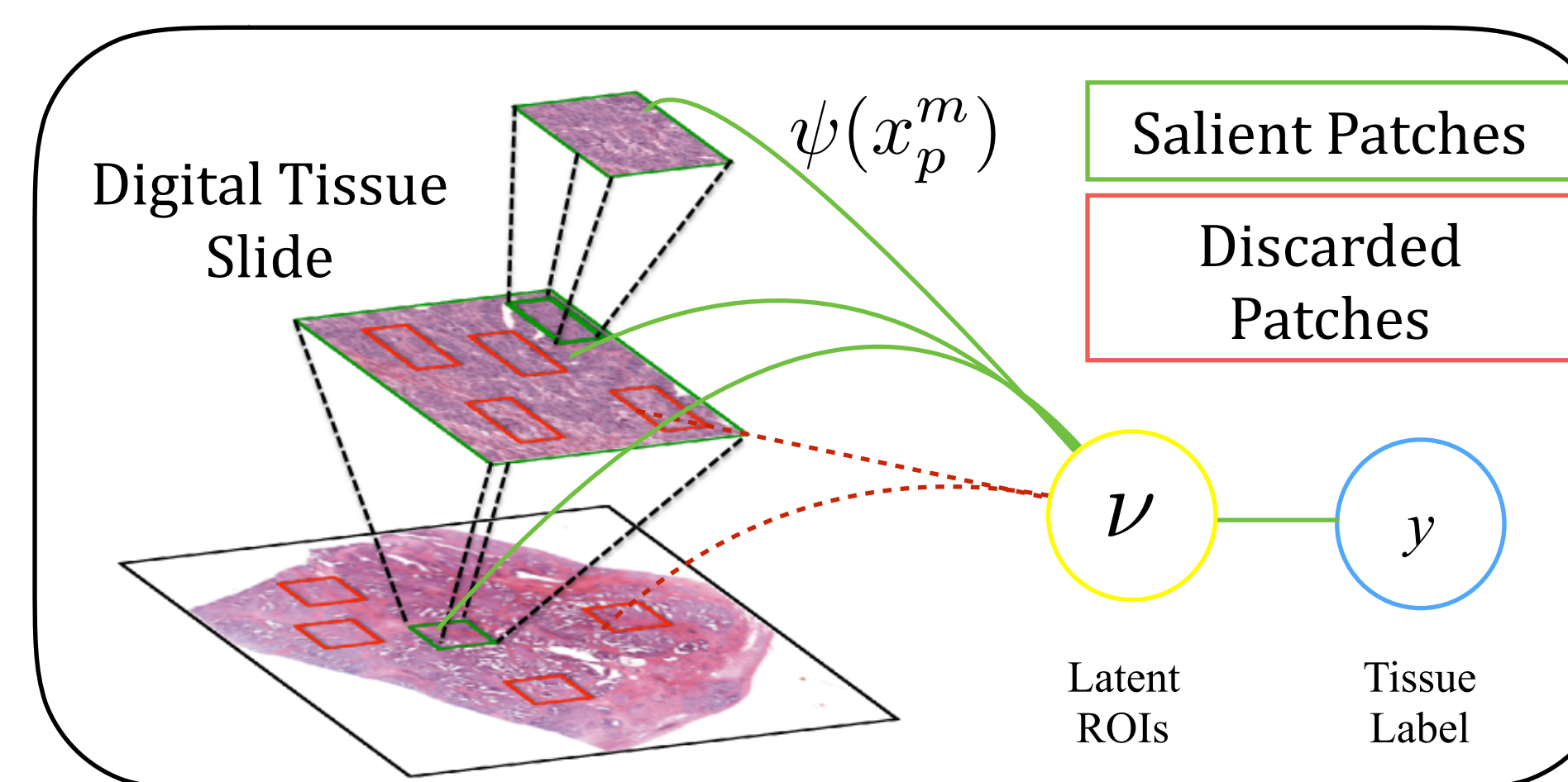
Predicting OC Subtypes on Unseen Test Images



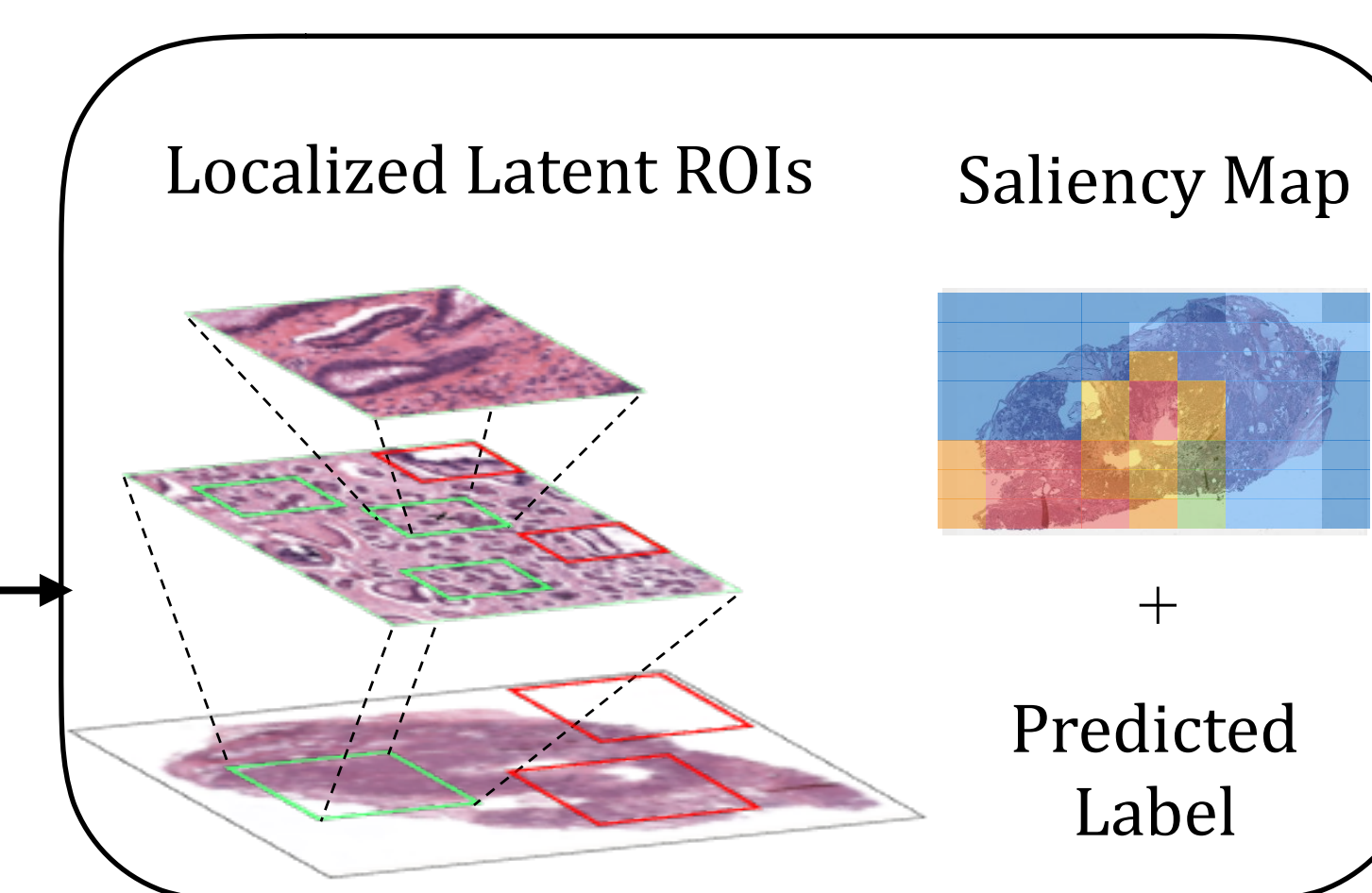
Leave-One-Out Validation on 40 Patients

- ✓ Automatically extracts relevant biomarkers
- ✓ Intuitively follows clinician's diagnostics
- ✓ Sensitive to variability in the data

4. Learning to Identify Abnormal Regions Indicative of OC Subtypes in Biopsies

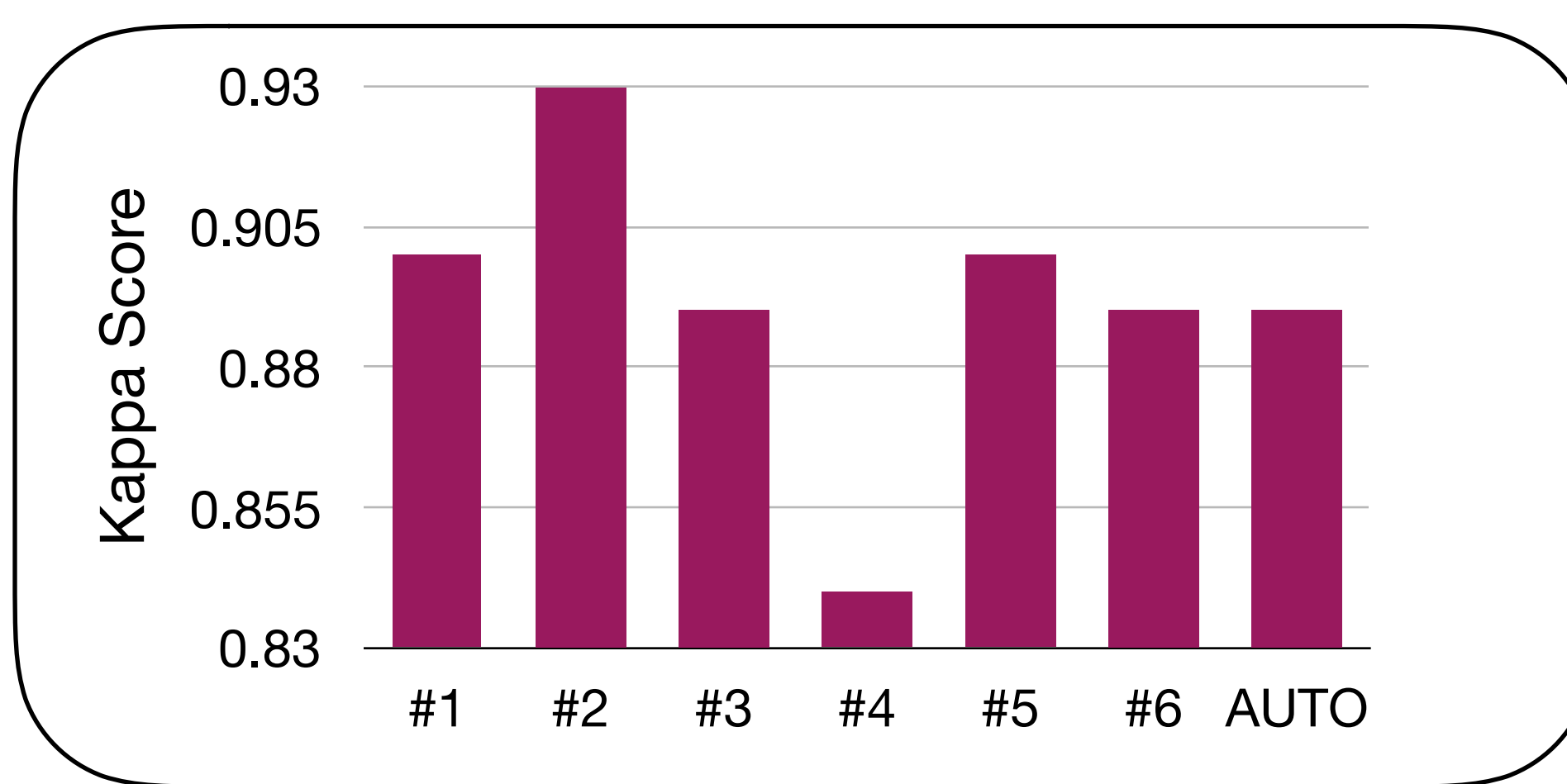


Proposed Context-Aware Classifier⁵

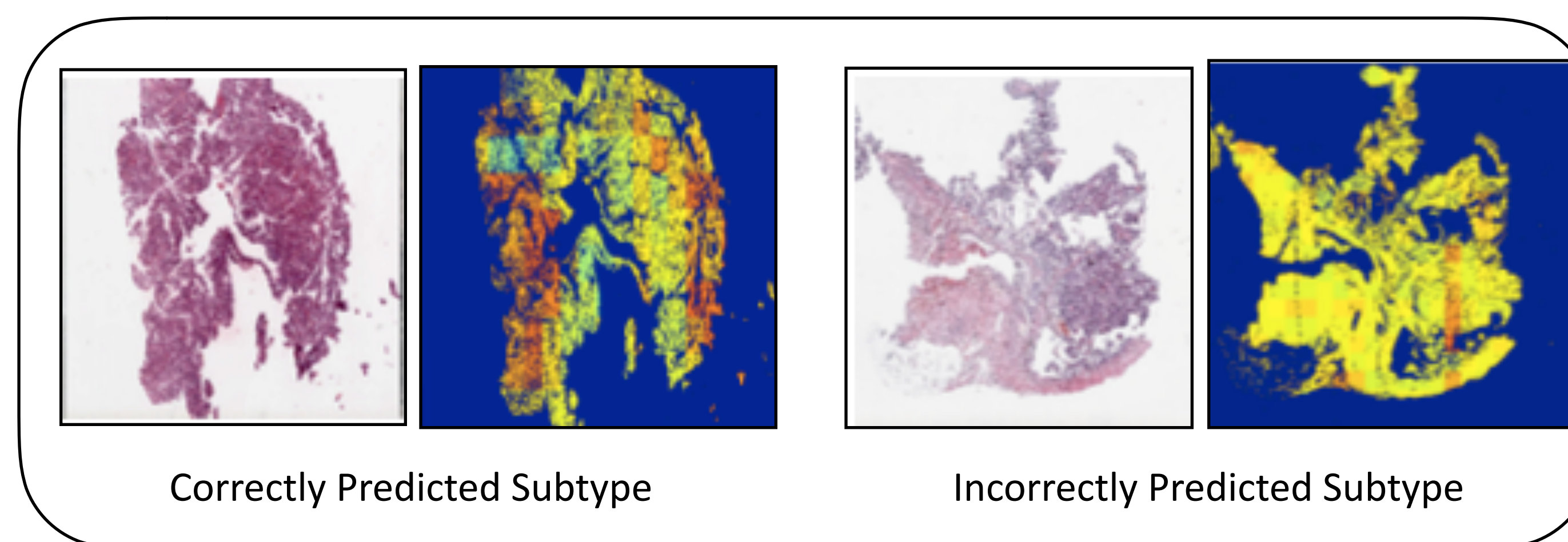


Classifier's Output

- ✓ Weakly-supervised
- ✓ Highlights abnormality
- ✓ More intuitive



Comparison of the automatic system with six experts



Validation on 150 patients from different pathology centres

1. <http://www.bccancer.bc.ca/>
 2. A. McPherson et al. Divergent modes of clonal spread and intraperitoneal mixing in high-grade serous ovarian cancer, Nature 2016
 3. A. BenTaieb et al. Clinically-Inspired Automatic Classification of Ovarian Carcinoma Subtypes. Journal of Pathology Informatics, 2016
 4. A. BenTaieb et al. Automatic Diagnosis of Ovarian Carcinomas via Sparse Multiresolution Tissue Representation, MICCAI 2015
 5. A. BenTaieb et al. A Structured Latent Model for Ovarian Carcinoma Subtyping from Histopathology Slides. Medical Image Analysis, 2017