



October 4-6, 2022
Agadir - Morocco

Investigate your ML model's prediction



Experts
Machine Learning

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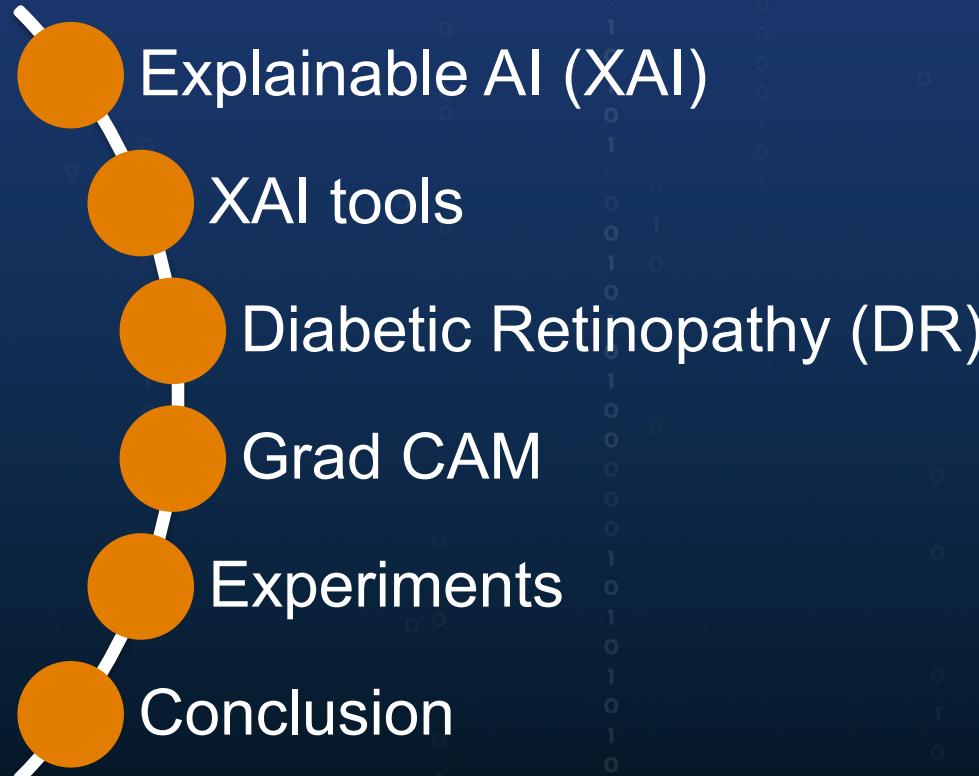
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#DevoxxMA

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X
HUB



TensorFlow User Group Casablanca (TFUG Casablanca) is a local community of technologists who are interested in advancing their knowledge of TensorFlow, its use cases, and applications. So far, it has reached 1k members in its Facebook group.





Explainable AI (XAI)



What is XAI?

Explainable AI is a set of tools and frameworks to help you understand and interpret predictions made by your machine learning models. With it, you can debug and improve model performance, and help others understand your models' behavior.

Model Interpretation

Interpretability is the degree to which a human can understand the cause of a decision.

The three most important aspects of model interpretation are:

- Transparency
- The ability to question
- The ease of understanding

Source: Dphi XAI course

Global & Local interpretation

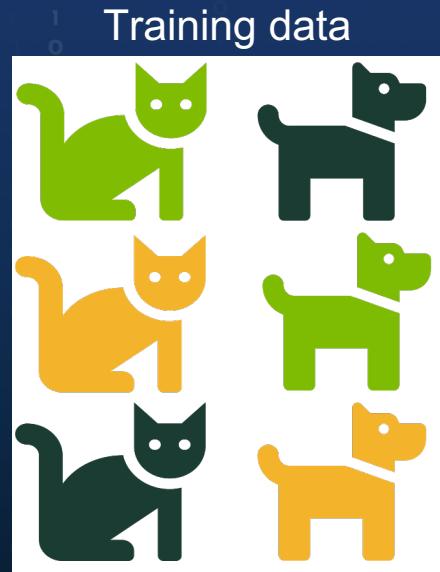
Global: looking at the entire dataset, some features are the most predictive.



Local: a certain feature (like age) is the most important feature for making a certain prediction.

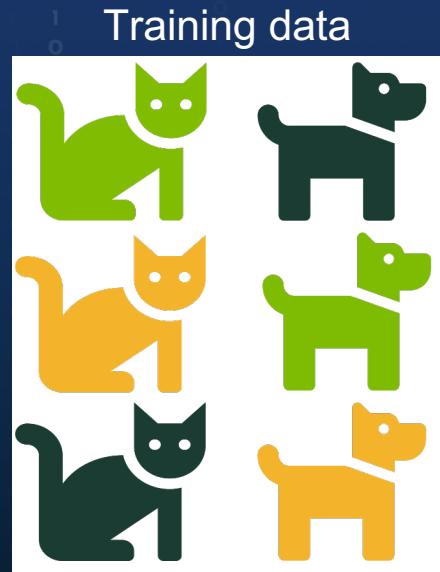


Why XAI?



Why did you do that?
Why not something else?
When do you succeed?
When do you fail?
When can I trust you?
How do I correct an error?

Why XAI?



Model



Cat
It has fur,
whiskers and
claws



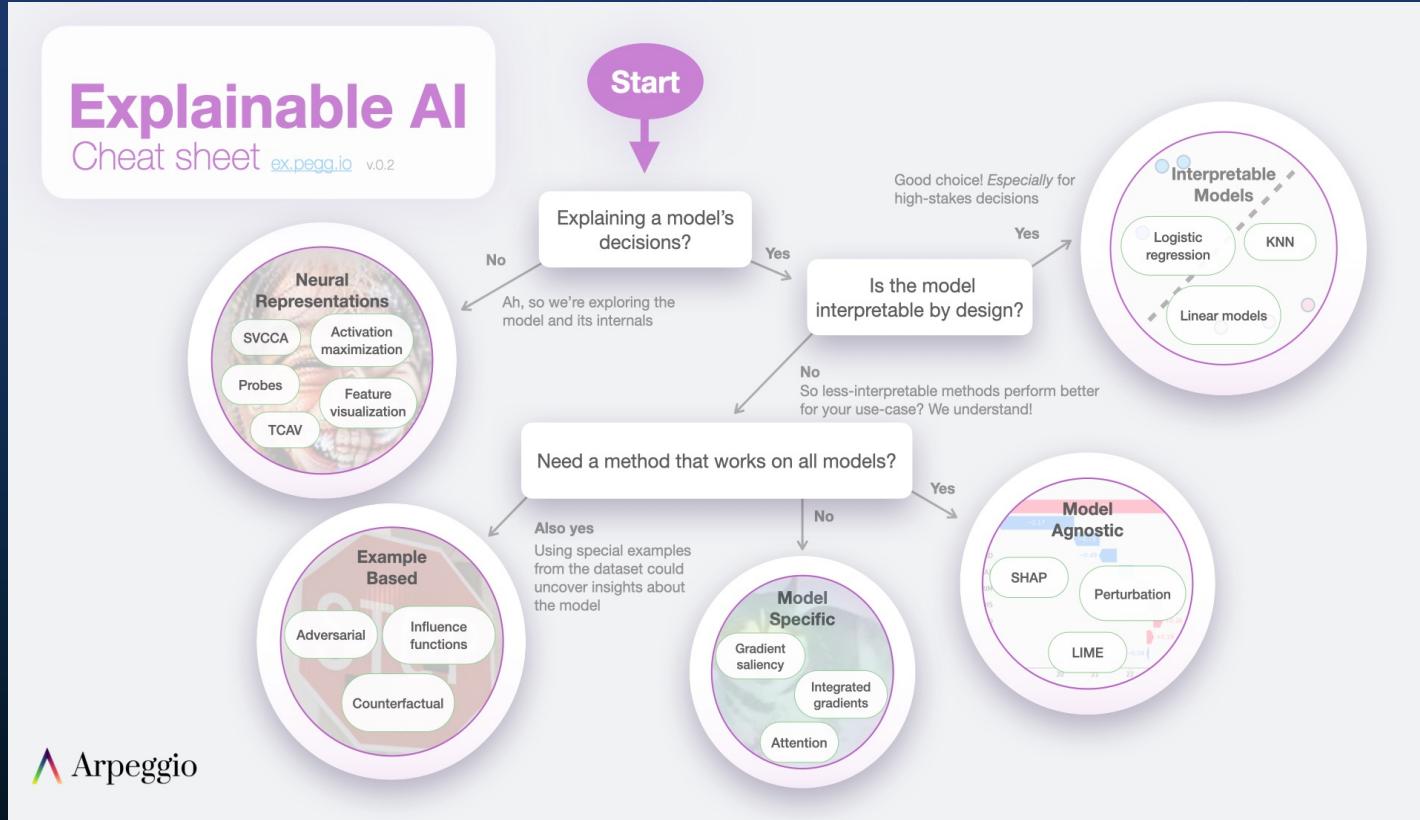
I understand why
I understand why not
I know when:
- You will succeed
- You will Fail
- To trust you
I know why you erred



XAI tools/libraries



Tools/Libraries





Diabetic Retinopathy (DR)



Definition

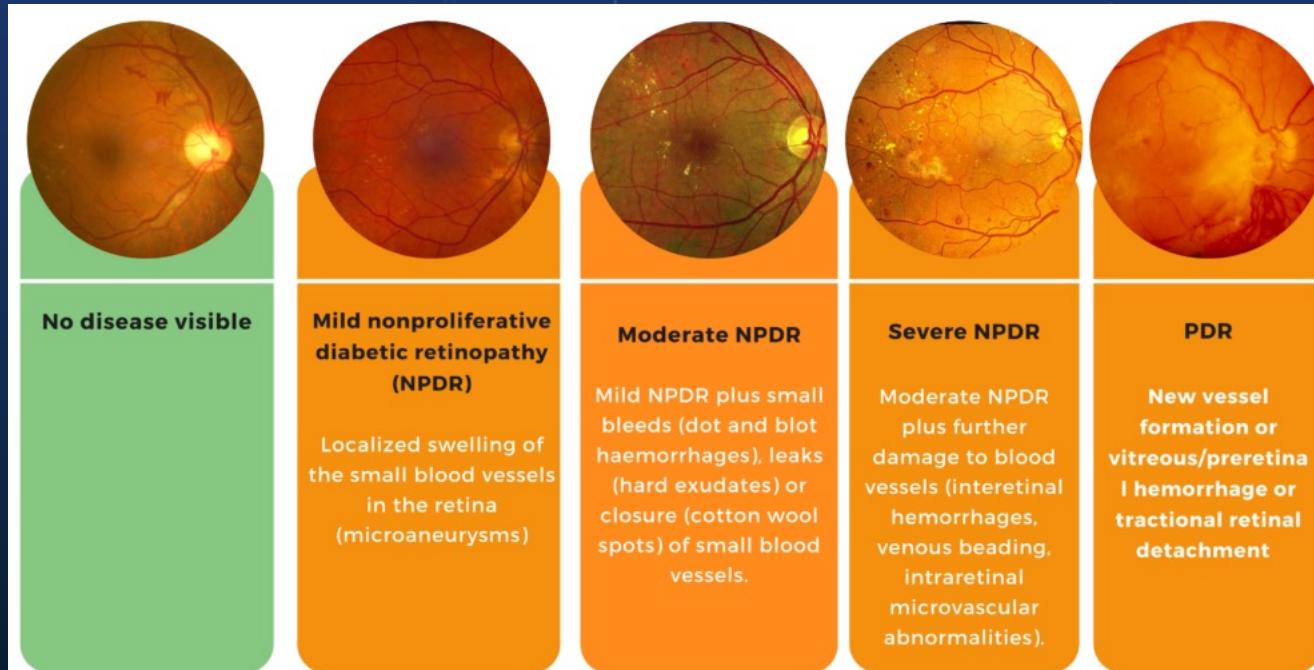
‘Diabetic Retinopathy (DR) is a complication of diabetes, caused by high blood sugar levels damaging the back of the eye (retina). It can cause blindness if left undiagnosed and untreated.’

Source: [NHS UK](#)

‘Globally, the number of people with DR will grow from 126.6 million in 2010 to 191.0 million by 2030.’

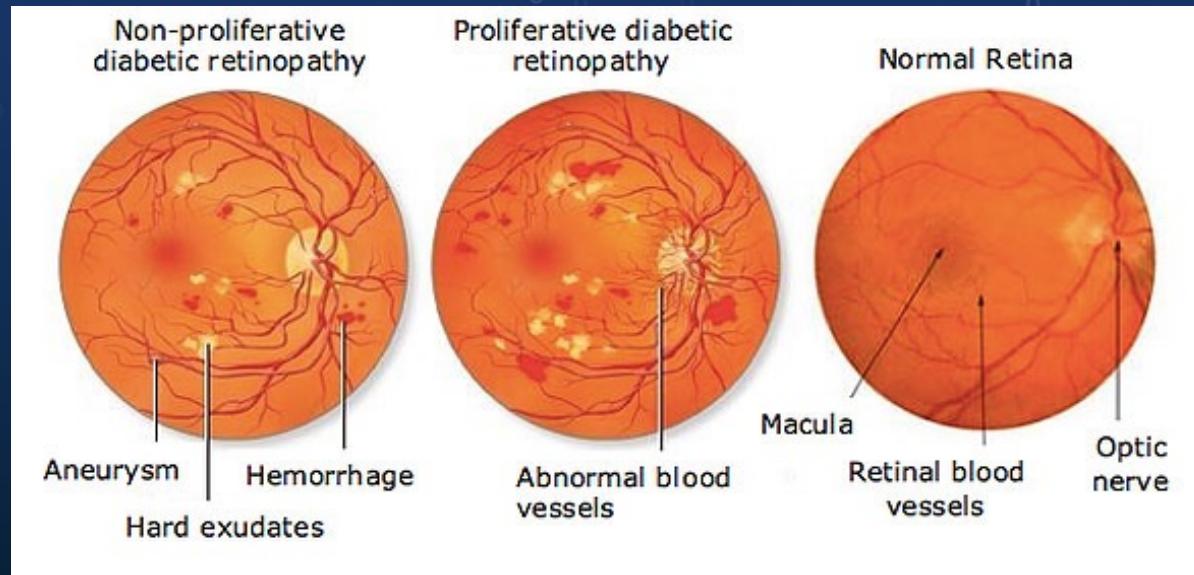
Source: [10.4103/0301-4738.100542](#)

Symptoms by grade



Source: <https://www.ophthalytics.com/our-technology/diabetic-retinopathy/>

Symptoms by grade



Source: <https://lowvisionaids.org/diabetic-retinopathy/>



Grad CAM

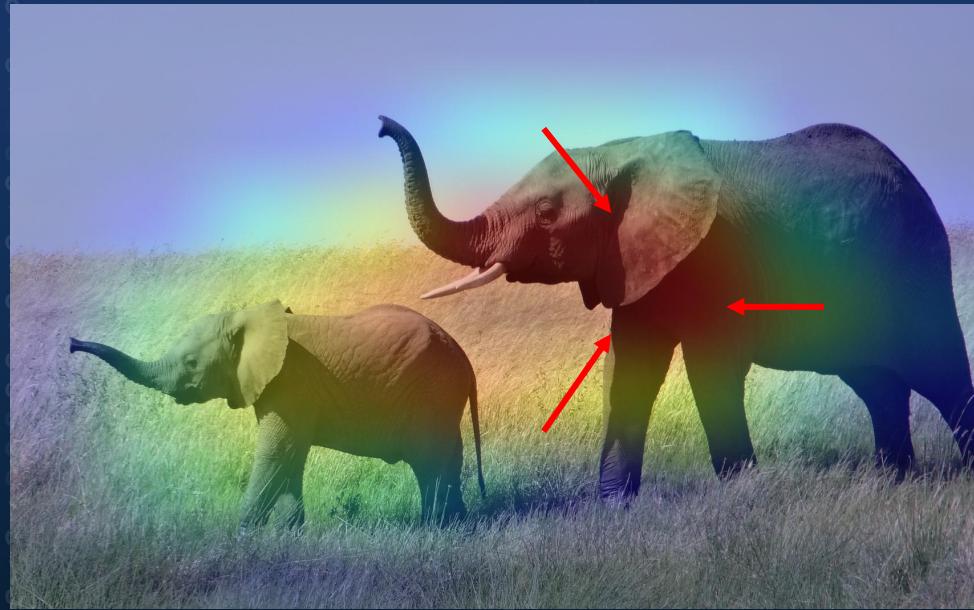


#DevoxxMA

Definition

Gradient-weighted Class Activation Mapping (Grad-CAM), uses the gradients of any target concept, flowing into the final convolutional layer to produce a coarse localization map highlighting important regions in the image for predicting the concept.

Source: [arXiv:1610.02391](https://arxiv.org/abs/1610.02391)



Source: https://keras.io/examples/vision/grad_cam/

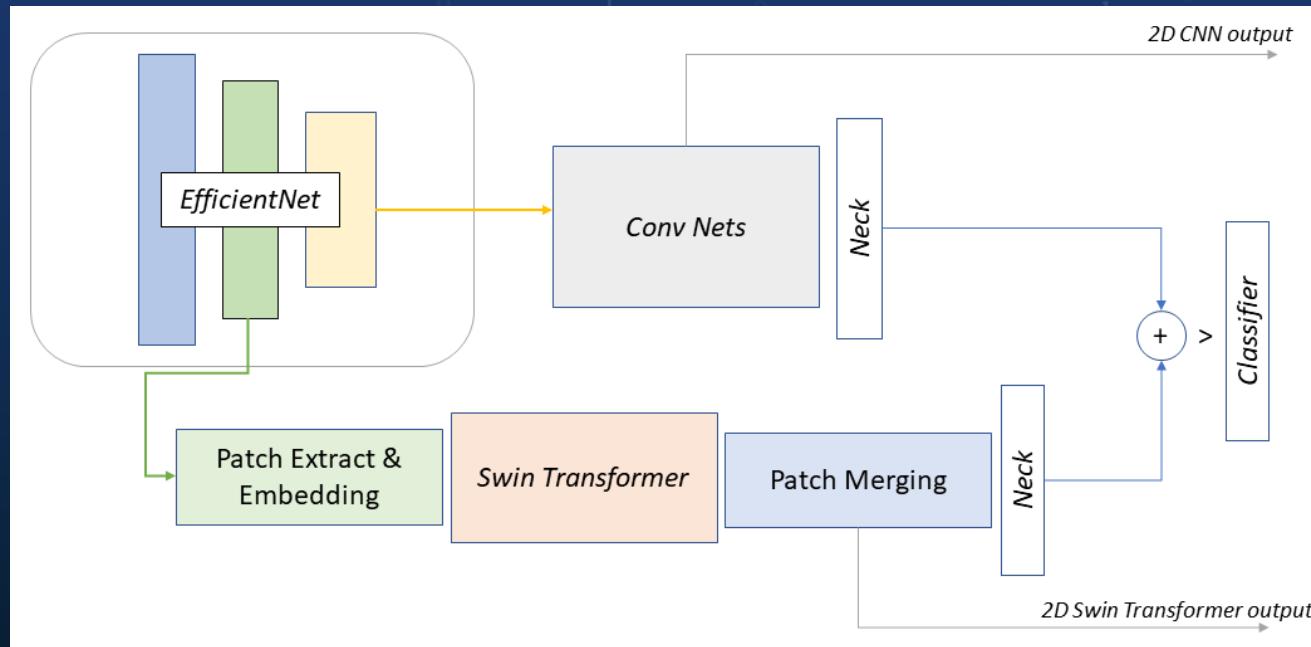


Experiments



#DevoxxMA

Model

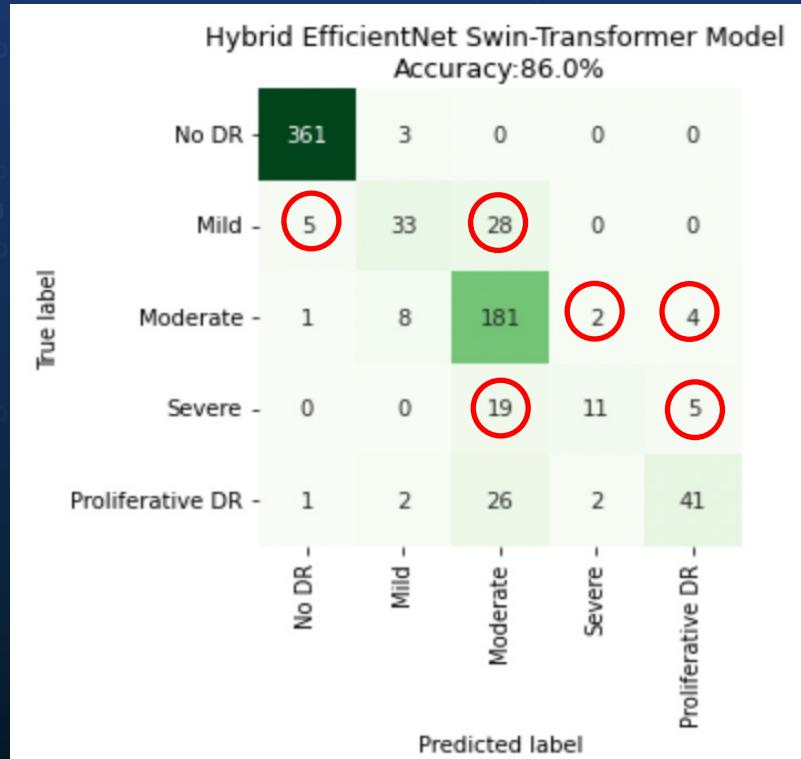


Source: <https://www.kaggle.com/code/ipythonx/tf-hybrid-efficientnet-swin-transformer-gradcam/notebook>

Confusion Matrix

In brief:

- No DR confused as Mild
- Mild confused as No DR and Moderate
- Moderate confused as (mainly) Mild, Severe and PDR
- Severe confused as Moderate and PDR
- PDR confused (mainly) as Mild, Moderate and Severe

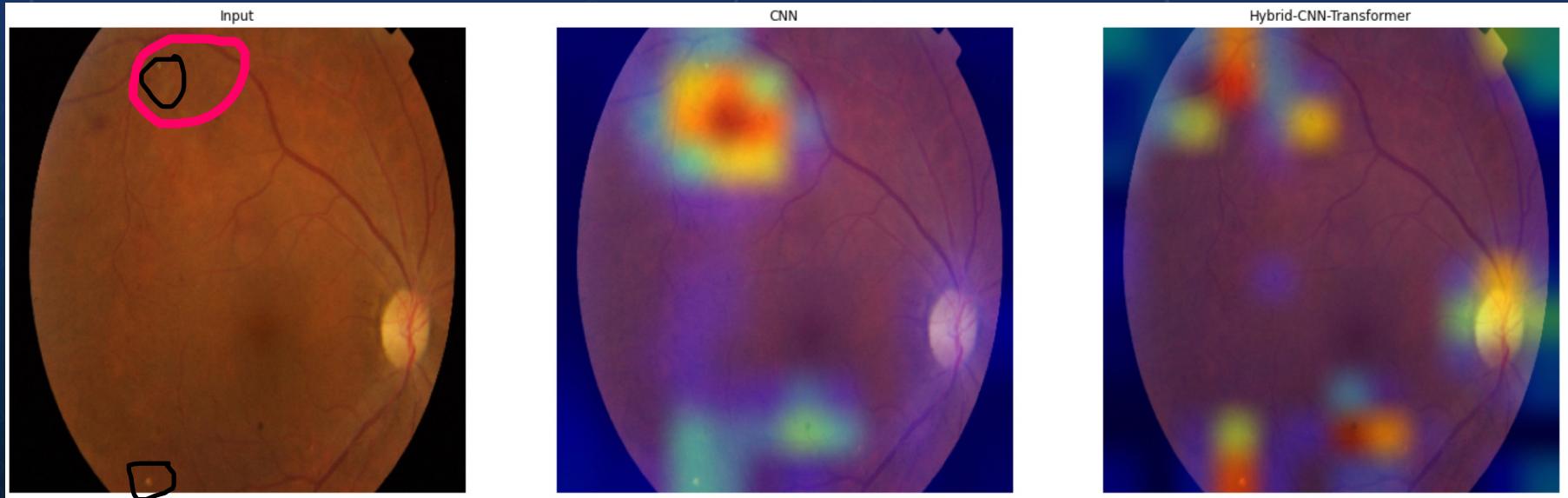


Understand the model: Failures



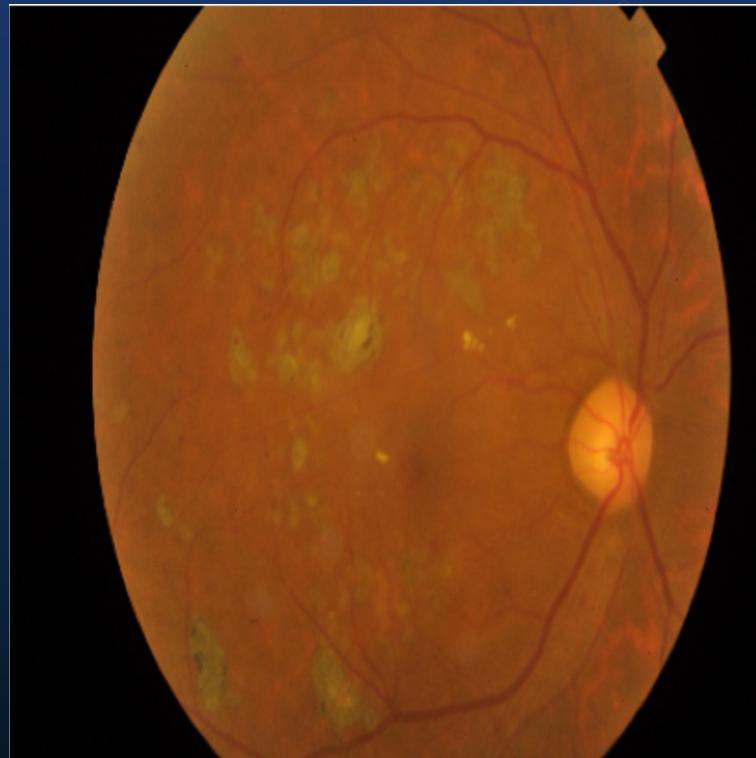
Mild mistaken as Moderate DR

Understand the model: Failures



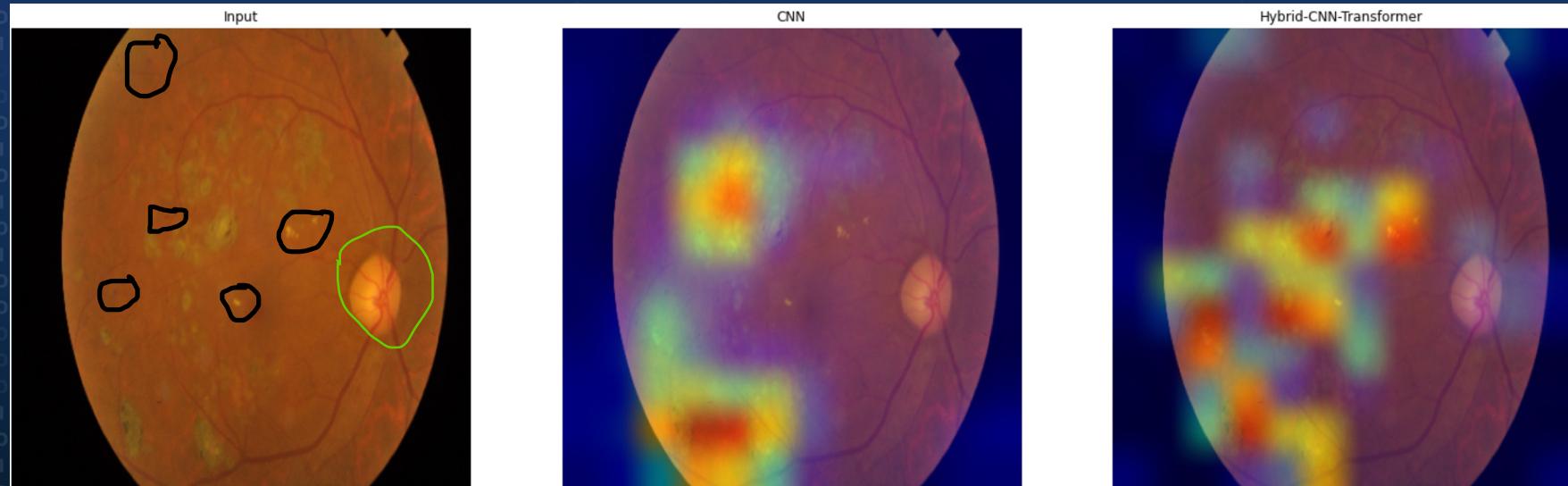
Mild mistaken as Moderate DR

Understand the model: Failures



Moderate mistaken as Proliferative DR

Understand the model: Failures



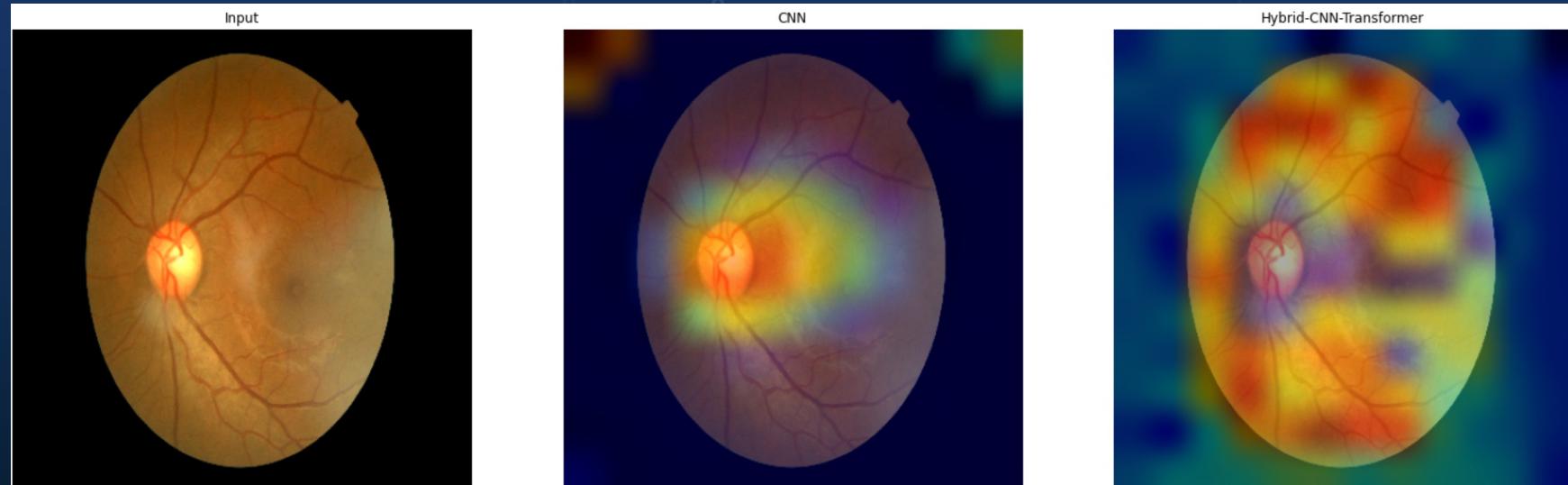
Moderate mistaken as Proliferative DR

Understand the model: Success



No DR

Understand the model: Success

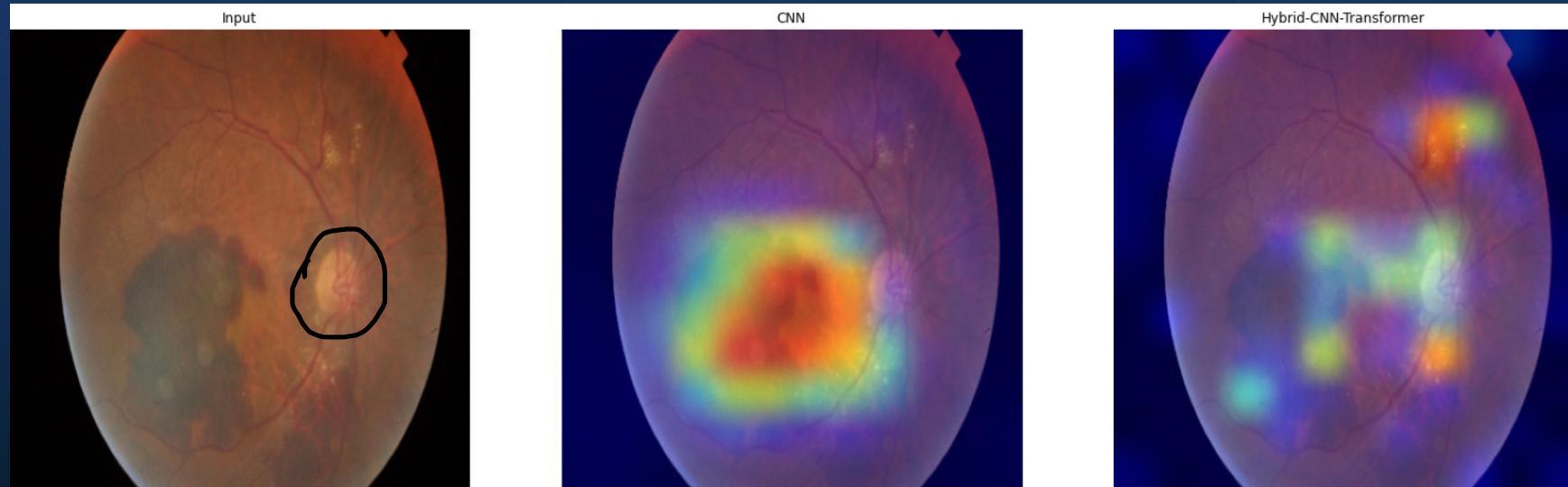


Understand the model: Success

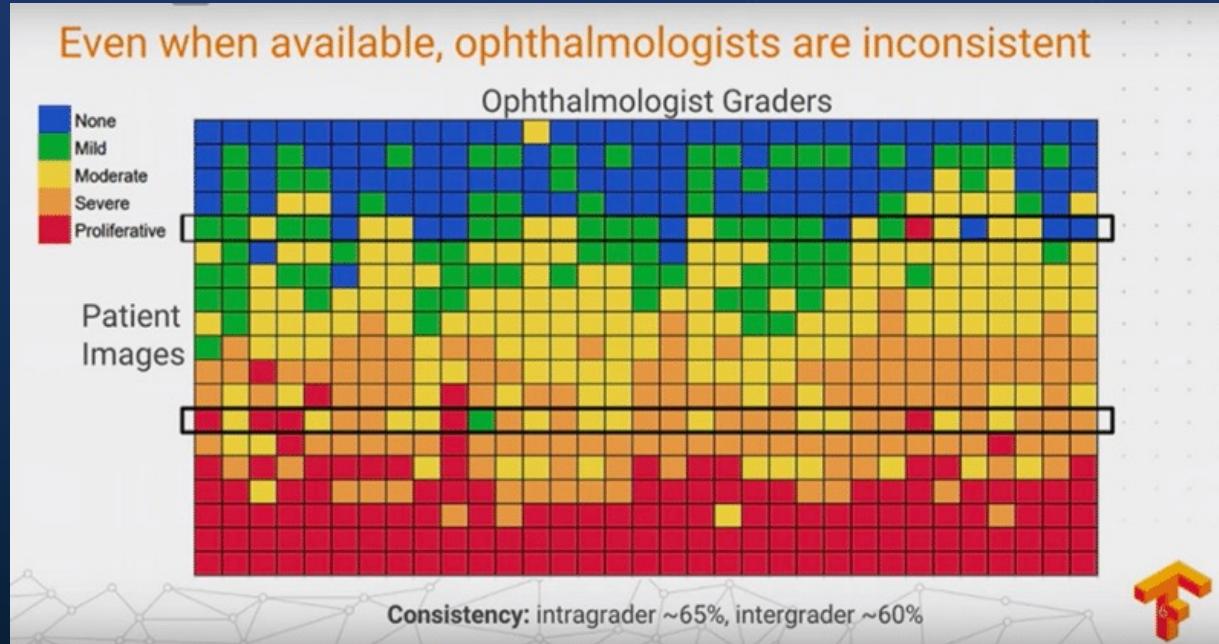


PDR

Understand the model: Success

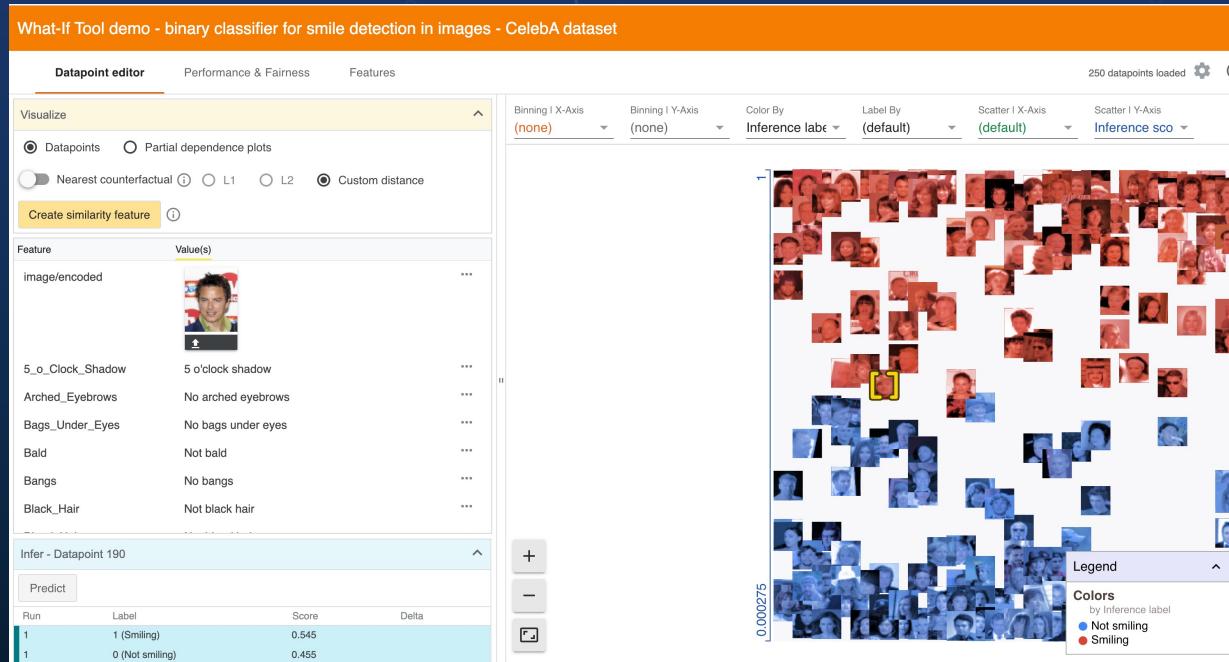


Challenges



Google showed that ophthalmologists' diagnoses differ for same fundus image. Source: (Krause et al., 2017)

What-If



Source: <https://pair-code.github.io/what-if-tool/get-started/>

Resources



A screenshot of a course card from DPhi. At the top left is a circular profile picture of a brain. To its right is a green circular icon with a white "dφ" symbol. Below these are two buttons: "Intermediate" and "Enrolled" with a checkmark icon. The course title "Explainable AI" is displayed in bold black text. Below the title is a list item showing "7 Modules". A descriptive text below reads: "Make the decision-making process from your ML model transparent and qu...". At the bottom is a green button with the text "Go to course >".

A screenshot of the book cover for "Interpretable Machine Learning: A Guide for Making Black Box Models Explainable" by Christoph Molnar. In the top right corner of the cover is a red circular badge with the text "Second Edition". The cover features a black and white illustration of a small figure standing next to a complex circuit board that has been partially buried in the ground, with grass growing around it. The author's name, "Christoph Molnar", is at the bottom of the cover.



Thank you! Questions?