



## 1. Input Pipeline

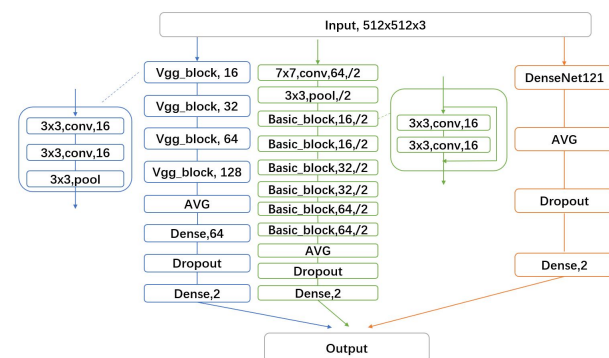
- IDRID Dataset
  - a dataset of retinal images with and without signs of diabetic retinopathy
- Preprocessing and Augmentation
  - For each image:
    - ▶ normalize to [0, 1]
    - ▶ resize to (512, 512, 3)
    - ▶ augmentation
  - For dataset:
    - ▶ load csv file
    - ▶ create tfrecords
    - ▶ balance dataset

## 2. Model and Training

Three models, namely vgg-like, resnet-like and transfer model (densenet121) were implemented. At the end, ensemble learning was applied by combining three models.

- Overview of Model Architectures  
The architectures of all three models are shown in fig 1.
  - Vgg-like model
    - ▶ base filters 16
    - ▶ 4 vgg blocks
    - ▶ dropout rate 0.5
  - Resnet-like model
    - ▶ base filters 16

- ▶ 6 basic blocks
- ▶ dropout rate 0.5
- Transfer model
  - ▶ GAP layer, dropout layer and a classification output layer on top of the model
  - ▶ dropout rate 0.4
  - ▶ first 88 convolutional layers frozen, the other layers trainable
- Ensemble learning
  - ▶ Averaging
  - ▶ Voting



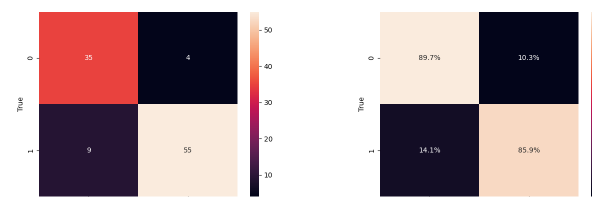
**Figure 1:** Illustration of the ensemble model

- Training Details
  - Class weighted balanced loss and accuracy
    - ▶ Multiply the loss and accuracy of each sample by the inverse of the class weight.
  - Optimizer
    - ▶ Adam
  - Learning rate
    - ▶ vgg-like model: 1e-3
    - ▶ resnet-like model: 1e-3

- ▶ transfer model: 1e-6

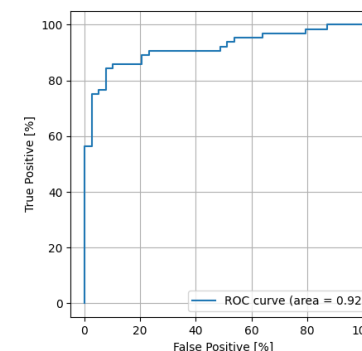
## 3. Evaluation

- Confusion matrix
  - The confusion matrix test on vgg-like model is shown in fig2.



**Figure 2:** Confusion Matrix

- ROC curve
  - The ROC curve test on vgg-like model is shown in fig3.



**Figure 3:** ROC curve

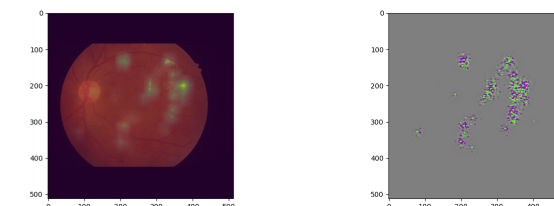
- F1 score
  - harmonic mean of the precision and recall, shown in fig4

- more suitable to unbalanced dataset
- reached about 0.9

$$F1\ Score = 2 \times \frac{recall \times precision}{recall + precision}$$

**Figure 4:** Definition of F1 score

- Deep visualization
  - The performance in form of grad-CAM test on vgg-like model is shown in fig5.



**Figure 5:** Deep visualization

## 4. Results

Overall, vgg-like model performs slightly better. After ensemble learning, the accuracy is further improved.

Architecture	F1 Score	Accuracy
Vgg-like	0.89	87.4%
Resnet-like	0.89	87.4%
Transfer(densenet121)	0.88	84.5%
Ensemble	0.90	88.3%

**Table 1:** Results for binary classification