Skin Lesion Classification for Cancer Detection

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The Problem

- Melanoma kills about 60,000 people a year
- Early detection has high impact on survival rate
- Professional medical diagnosis costs money/time

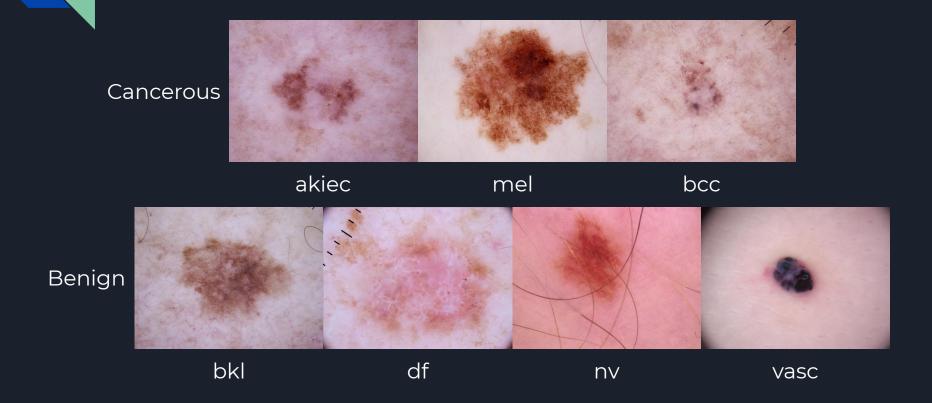
Dataset

- HAM10000 dataset (https://arxiv.org/pdf/1803.10417.pdf)
- Over 10000 labelled images of skin lesions
- 7 classes, 3 are cancerous

Lesion Classes

- Cancerous
 - o mel Melanoma
 - o akiec Aktinic keratoses or intraepithelial carcinoma
 - bcc Basal cell carcinoma
- Benign
 - bkl Benign keratoses
 - df Dermatofibroma
 - o nv Melanocytic nevi
 - vasc Vascular lesions

Lesion Class Examples



Modeling Overview

- Created 2 CNNs in PyTorch to do image classification
 - LeNet-like architecture trained from scratch
 - ResNet-50 pre trained on ImageNet and fine tuned on HAM10000

LeNet-like Details

```
Architecture:
                                       Output Shape
    Layer (type:depth-idx)
                                                                 Param #
    Conv2d: 2-1
                                       [64, 16, 224, 224]
                                                                 1,216
    ReLU: 2-2
                                       [64, 16, 224, 224]
    MaxPool2d: 2-3
                                       [64, 16, 112, 112]
    Dropout: 2-4
                                       [64, 16, 112, 112]
    Conv2d: 2-5
                                       [64, 16, 112, 112]
                                                                 2,320
    ReLU: 2-6
                                       [64, 16, 112, 112]
    MaxPool2d: 2-7
                                       [64, 16, 56, 56]
    Dropout: 2-8
                                       [64, 16, 56, 56]
    Conv2d: 2-9
                                       [64, 32, 56, 56]
                                                                 4,640
    ReLU: 2-10
                                       [64, 32, 56, 56]
    MaxPool2d: 2-11
                                       [64, 32, 28, 28]
    Dropout: 2-12
                                       [64, 32, 28, 28]
    Flatten: 2-13
                                       [64, 25088]
    Linear: 2-14
                                       [64, 512]
                                                                 12,845,568
    ReLU: 2-15
                                       [64, 512]
    Dropout: 2-16
                                       [64, 512]
    Linear: 2-17
                                       [64, 512]
                                                                 262,656
    ReLU: 2-18
                                       [64, 512]
    Dropout: 2-19
                                       [64, 512]
    Linear: 2-20
                                       [64, 7]
                                                                 3,591
Hyperparameters:
    batch size = 64
    optimizer = Adam
    learning rate = 1e-4
    dropout = 0.2
```

ResNet-50 Details

```
Architecture:
   See more info at https://pytorch.org/vision/stable/ modules/torchvision/models/resnet.html
   Layer (type:depth-idx)
                                         Output Shape
                                                                  Param #
   Conv2d: 2-1
                                         [64, 64, 112, 112]
                                                                  (9,408)
   BatchNorm2d: 2-2
                                         [64, 64, 112, 112]
                                                                  (128)
   ReLU: 2-3
                                         [64, 64, 112, 112]
   MaxPool2d: 2-4
                                         [64, 64, 56, 56]
   Sequential: 2-5
                                         [64, 256, 56, 56]
                                                                  (215,808)
   Sequential: 2-6
                                        [64, 512, 28, 28]
                                                                  (1,219,584)
   Sequential: 2-7
                                         [64, 1024, 14, 14]
                                                                  7,098,368
   Sequential: 2-8
                                         [64, 2048, 7, 7]
                                                                  14,964,736
   AdaptiveAvgPool2d: 2-9
                                         [64, 2048, 1, 1]
                                         [64, 7]
   Sequential: 2-10
                                                                  14,343
Hyperparameters:
   pretrained = True
   freeze = True
   batch size = 64
   optimizer = Adam
   learning rate = 1e-5
   dropout = 0.5
```

Model Comparison

- LeNet-Like validation accuracy: 49%
- ResNet-50 validation accuracy: 74%
- ResNet-50 test accuracy: 76%

Recommendations

- Deploy as app that can provide tentative diagnosis
- Keep a human in the loop
- Improve further by acquiring more data

Limitations

- Our model suffers low accuracy
- Visual analysis will likely never fully replace biopsy

Future Improvement

- More data would get us better results
- Synthetic data could be generated
 (https://medium.com/abacus-ai/gans-for-data-augmentation-21a69de6c60b)
- Data flywheel could be made in deployment

Questions?