Pre-trained Models in Computer Vision

Introduction

Pre-trained models are widely used in computer vision tasks such as **image classification**, **object detection**, **and segmentation**. These models are trained on large datasets (like **ImageNet** or **COCO**) and can be reused to solve new problems with minimal additional training.

They are categorized based on their **application type**, such as:

- Image Classification
- Object Detection
- Object Segmentation
- Image Segmentation

1. Pre-trained Models for Image Classification

These models assign a label (category) to an entire image.

- VGG16 / VGG19 simple CNN-based models trained on ImageNet.
- ResNet (ResNet50, ResNet101, ResNet152) deeper CNNs with skip connections.
- Inception (GoogLeNet, InceptionV3) efficient architecture using multi-scale filters.
- **DenseNet** connects each layer to every other layer for feature reuse.
- EfficientNet balances depth, width, and resolution for efficient training.
- **Vision Transformers (ViT, Swin Transformer)** transformer-based models for classification tasks.

✓ Use case: Cat vs Dog classifier, medical image classification (X-ray normal vs abnormal).

2. Pre-trained Models for Object Detection

These models locate and classify **multiple objects** in an image with bounding boxes.

- YOLO (You Only Look Once: v3, v4, v5, v7, v8) fast and real-time object detection.
- SSD (Single Shot Detector) efficient one-stage detector.
- Faster R-CNN region proposal network for accurate object detection.
- RetinaNet balances speed and accuracy, uses focal loss for handling class imbalance.
- **DETR (DEtection TRansformer)** transformer-based end-to-end detection model.
- **Use case:** Self-driving cars detecting pedestrians, traffic lights, and vehicles.

3. Pre-trained Models for Image Segmentation

These models classify each pixel of an image into a category.

- FCN (Fully Convolutional Network) first CNN-based segmentation approach.
- **U-Net** encoder-decoder model, widely used in medical imaging.
- **SegNet** another encoder-decoder network for pixel-wise segmentation.
- **DeepLab (V2, V3, V3+)** adds atrous (dilated) convolutions for better segmentation.
- PSPNet (Pyramid Scene Parsing Network) captures context at multiple scales.

Use case: Medical image segmentation (tumor detection), satellite image segmentation.

4. Pre-trained Models for Instance / Object Segmentation

These models detect **each object instance separately** and segment them at pixel level.

- Mask R-CNN extension of Faster R-CNN for pixel-level object segmentation.
- YOLACT real-time instance segmentation.
- **BlendMask** combines object detection with segmentation.
- **SOLO / SOLOv2 (Segmenting Objects by Locations)** instance segmentation without anchors.

Use case: Identifying and separating multiple overlapping objects (e.g., detecting people in a crowd).

5. Specialized Vision Models

- **CLIP (OpenAI)** connects vision and language, useful for zero-shot classification.
- SAM (Segment Anything Model, Meta) general-purpose segmentation model.
- **DINO / DINOv2** self-supervised vision transformers.

Sources of Pre-trained Models

- **TensorFlow Hub (tfhub.dev)** image classification, detection, segmentation models.
- **PyTorch Hub (pytorch.org/hub)** ResNet, YOLO, Faster R-CNN, etc.
- Hugging Face (huggingface.co/models) hosts vision transformers, SAM, CLIP.
- Model Zoos (Torchvision, Detectron2, MMDetection) large repositories of computer vision models.

Conclusion

Pre-trained models are crucial in computer vision, enabling rapid development for tasks like image classification, object detection, image segmentation, and object/instance segmentation.

They are widely used in fields such as healthcare, autonomous vehicles, security, and remote sensing.