

Phishing Detector

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 - Faster-RCNN: used for crop the logo from screenshot
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Introduction

Background:

A phishing website is a fraudulent site that mimics legitimate websites with the intent to deceive users into providing sensitive information such as usernames and passwords.

Motivation:

It is not fair to determine the website is a phishing website or not based only on domain information.

Research Goal:

Develop a phishing detector framework to recognize the phishing websites based on brands' logo and domain information.



google.com

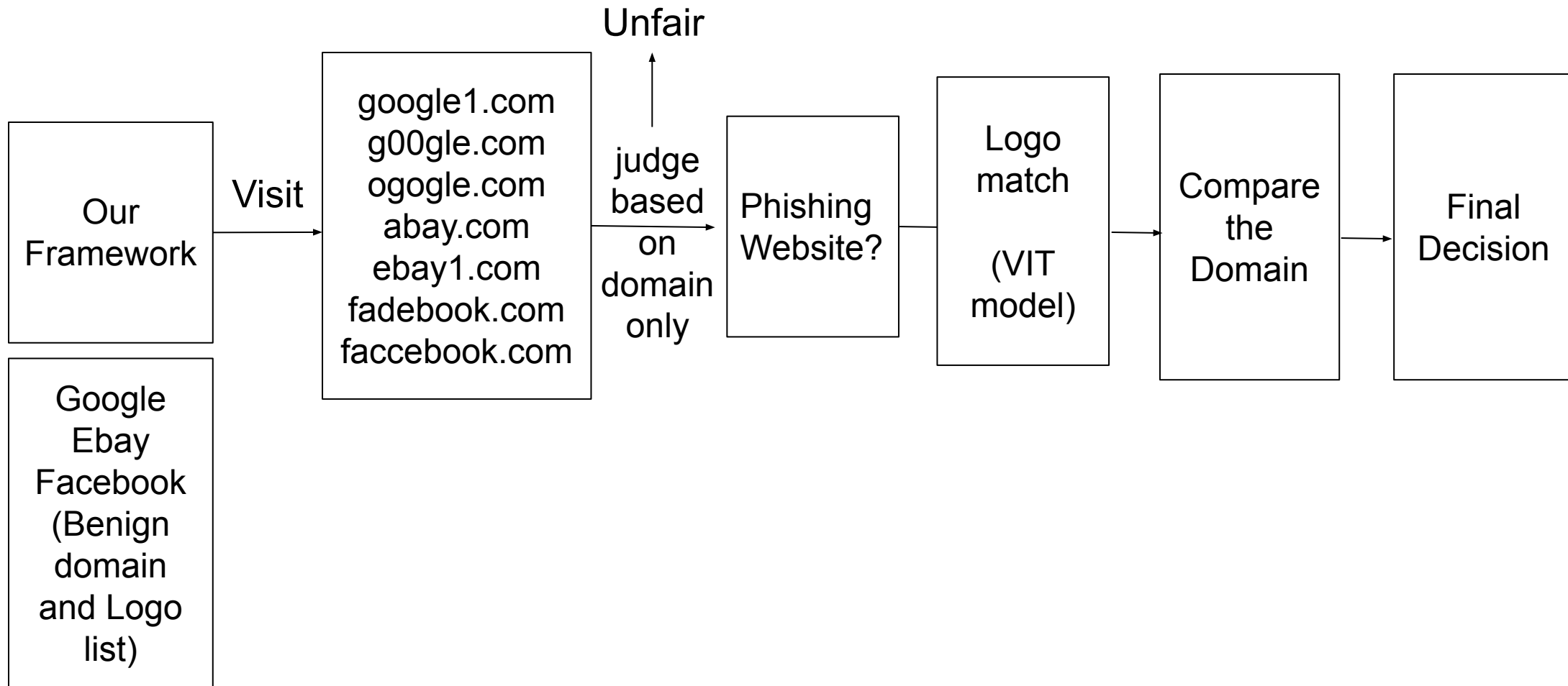


facebook.com



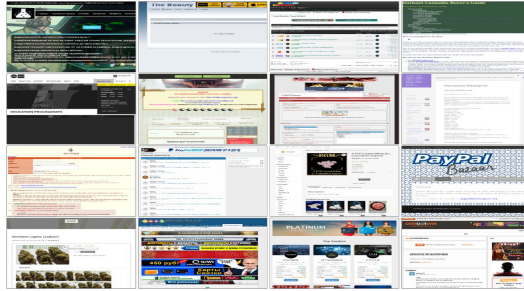
ebay.com

Overview of Our Framework



Dataset

1. Faster RCNN: benign30k



2. ViT & Involution: Logo2K+



4. Threshold: benign25k and phish25k

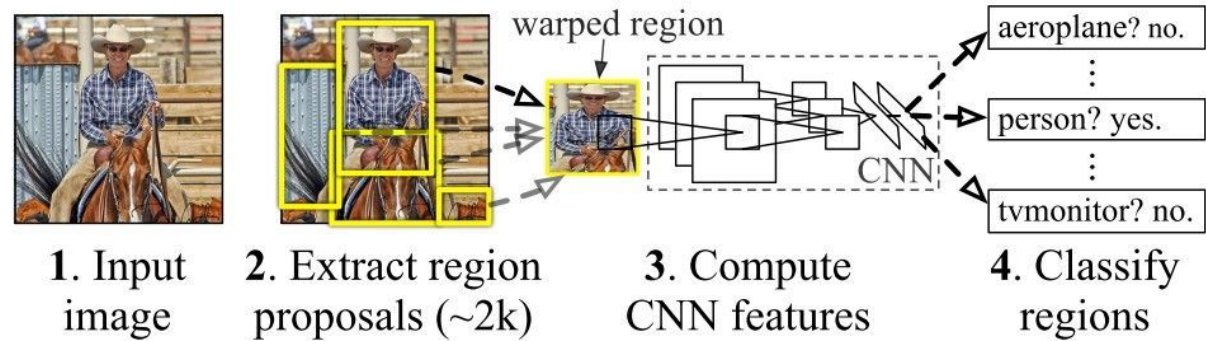


4. Evaluation: Web Archive



Logo Clip: Faster R-CNN

Faster R-CNN (Region-based Convolutional Neural Network) is an advanced deep learning model that builds on the foundations of previous models like R-CNN and Fast R-CNN to efficiently and accurately **detect objects** within images.

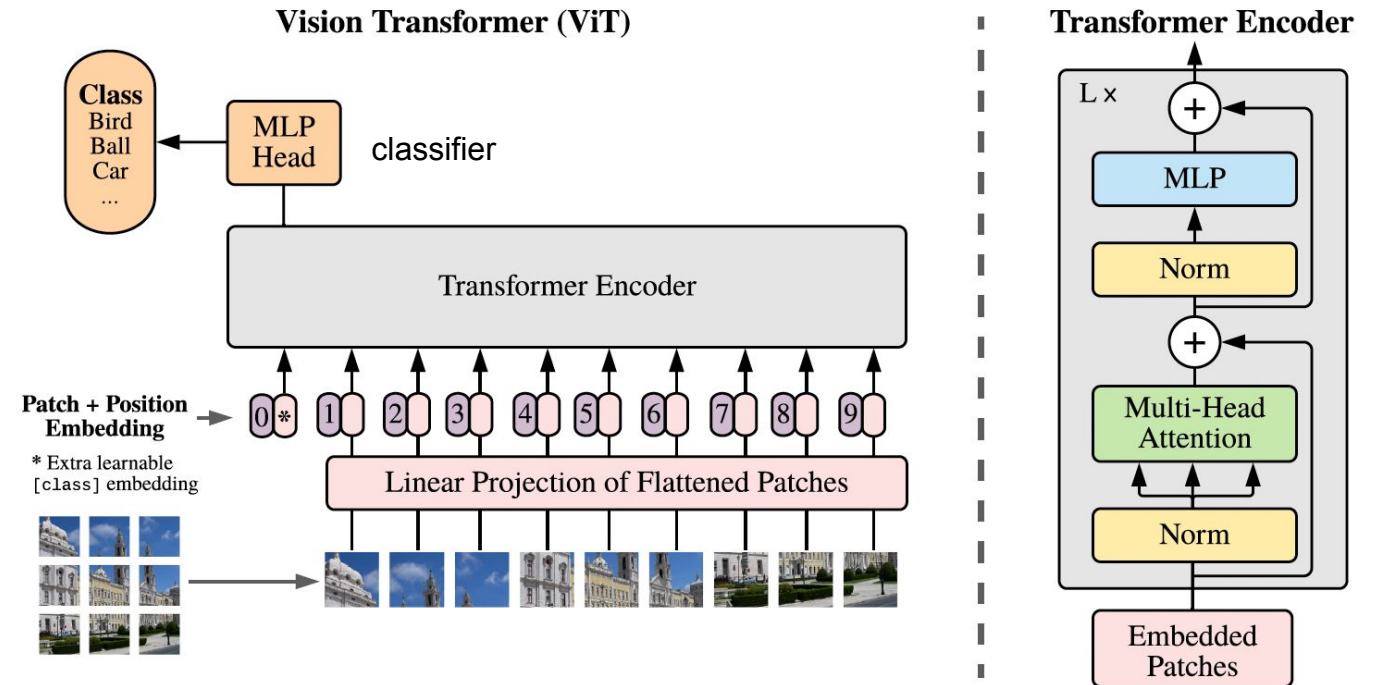


Method — ViT

ViT is used to **compare logo similarity** by encoding logos as sequences of image patches and then comparing their embeddings to a target list.

Model Structure:

- ❖ The input image is divided into fixed-size patches.
- ❖ These patches are linearly embedded into a higher-dimensional space.
- ❖ A sequence of positional embeddings is added to these patch embeddings to retain positional information.
- ❖ The resulting sequence of vectors is fed into a standard transformer encoder that uses self-attention mechanisms.
- ❖ The output of the transformer can be used for various tasks, including classification and similarity comparison.

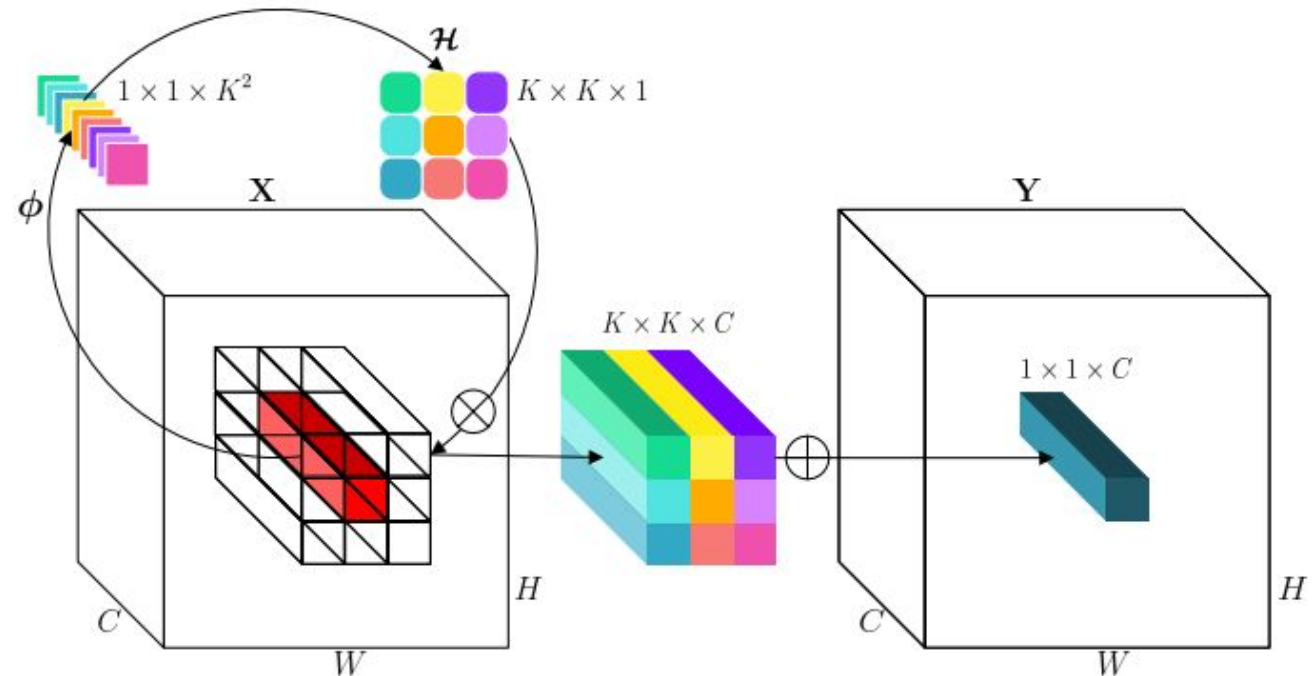


Method — Involution

Similar to ViT, involution can be adapted for tasks like **comparing visual similarities** by generating dynamic kernels that adapt to the specific features of each logo.

Model Structure:

- ❖ Instead of using fixed kernels, involution generates kernels based on the input feature map itself.
- ❖ This generation process involves a kernel-generating function that maps the input features to kernel weights.
- ❖ These dynamic kernels are then applied spatially across the input feature map.
- ❖ The output feature map reflects more adaptive and input-specific processing, which can be beneficial for detailed tasks like logo comparison.



Method — Novelty

- ❑ **ViT** introduces the application of transformers, previously used primarily in natural language processing, to the domain of image recognition. It treats images as sequences of patches and processes them using a transformer encoder, which allows it to capture complex spatial hierarchies.
- ❑ **Involution** is designed as an alternative to convolution, aiming to reduce computational complexity and increase model efficiency. Unlike convolution, which aggregates features over a spatial area using shared weights, involution uses spatial-specific weights. This means the weights are generated dynamically based on the input, allowing for more adaptable and data-dependent processing.

Evaluation Dataset: collected from Archive.org for recent 7 years change

- Total: 1,941 with 3 brands
 - Benign: 501
 - Phishing: 1440

Results

| Brand | Total | ViT Detection Rate | Involution Detection Rate |
|----------|-------|--------------------|---------------------------|
| Ebay | 390 | 0.8051282051 | 0.9923076923 |
| Google | 393 | 0.2875318066 | 0.8727735369 |
| Facebook | 1158 | 0.2815198618 | 0.9343696028 |
| Total | 1941 | 0.3879443586 | 0.9335394127 |

Any Question?