# C-Flow

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Cflow.

Real-Time Unsupervised Anomaly Detection via Conditional Normalizing Flows.

For more details, see the paper: <u>Real-Time Unsupervised Anomaly Detection via Conditional</u> Normalizing Flows.

#### class

```
anomalib.models.image.cflow.lightning_model.Cflow(backbone='wide_resnet50_2',
layers=('layer2', 'layer3', 'layer4'), pre_trained=True,
fiber_batch_size=64, decoder='freia-cflow', condition_vector=128,
coupling_blocks=8, clamp_alpha=1.9, permute_soft=False, lr=0.0001)
Bases: AnomalyModule
```

Bases: AnomalyModule

PL Lightning Module for the CFLOW algorithm.

#### **Parameters:**

- **backbone** (*str, optional*) Backbone CNN architecture. Defaults to "wide\_resnet50\_2".
- **layers** (*Sequence*[*str*], *optional*) Layers to extract features from. Defaults to ("layer2", "layer3", "layer4").
- **pre\_trained** (bool, optional) Whether to use pre-trained weights. Defaults to True.
- **fiber\_batch\_size** (*int, optional*) Fiber batch size. Defaults to [64].
- **decoder** (*str, optional*) Decoder architecture. Defaults to "freia-cflow".
- **condition\_vector** (*int, optional*) Condition vector size. Defaults to [128].
- **coupling\_blocks** (*int, optional*) Number of coupling blocks. Defaults to 8.
- **clamp\_alpha** (*float, optional*) Clamping value for the alpha parameter. Defaults to 1.9.
- **permute\_soft** (*bool, optional*) Whether to use soft permutation. Defaults to False.
- Ir (float, optional) Learning rate. Defaults to 0.0001.

# configure\_optimizers()

Configure optimizers for each decoder.

#### **Returns:**

Adam optimizer for each decoder

## **Return type:**

Optimizer

# property learning\_type: LearningType

Return the learning type of the model.

#### **Returns:**

Learning type of the model.

## **Return type:**

LearningType

## property trainer\_arguments: dict[str, Any]

C-FLOW specific trainer arguments.

```
training_step(batch, *args, **kwargs)
```

Perform the training step of CFLOW.

For each batch, decoder layers are trained with a dynamic fiber batch size. Training step is performed manually as multiple training steps are involved

per batch of input images

#### **Parameters:**

- **batch** (*dict[str, str* | *torch.Tensor]*) Input batch
- \*args Arguments.
- \*\*kwargs Keyword arguments.

# **Return type:**

```
Union [Tensor, Mapping [str, Any], None]
```

#### **Returns:**

Loss value for the batch

# validation\_step(batch, \*args, \*\*kwargs)

Perform the validation step of CFLOW.

Similar to the training step, encoder features are extracted from the CNN for each batch, and anomaly map is computed.

#### **Parameters:**

- **batch** (*dict[str, str* | *torch.Tensor]*) Input batch
- \*args Arguments.
- \*\*kwargs Keyword arguments.

## **Return type:**

```
Union [Tensor, Mapping [str, Any], None]
```

#### **Returns:**

Dictionary containing images, anomaly maps, true labels and masks. These are required in *validation\_epoch\_end* for feature concatenation.

PyTorch model for CFlow model implementation.

```
class anomalib.models.image.cflow.torch_model.CflowModel(backbone, layers,
pre_trained=True, fiber_batch_size=64, decoder='freia-cflow',
condition_vector=128, coupling_blocks=8, clamp_alpha=1.9,
permute_soft=False)
```

Bases: Module

CFLOW: Conditional Normalizing Flows.

#### **Parameters:**

- **backbone** (*str*) Backbone CNN architecture.
- **layers** (*Sequence[str]*) Layers to extract features from.
- **pre\_trained** (bool) Whether to use pre-trained weights. Defaults to True.
- **fiber\_batch\_size** (*int*) Fiber batch size. Defaults to 64.
- **decoder** (*str*) Decoder architecture. Defaults to "freia-cflow".
- **condition\_vector** (*int*) Condition vector size. Defaults to 128.
- **coupling\_blocks** (*int*) Number of coupling blocks. Defaults to 8.
- clamp\_alpha (float) Clamping value for the alpha parameter. Defaults to 1.9.
- **permute\_soft** (*bool*) Whether to use soft permutation. Defaults to False.

# forward(images)

Forward-pass images into the network to extract encoder features and compute probability.

#### **Parameters:**

**images** (Tensor) – Batch of images.

#### **Return type:**

Tensor

#### **Returns:**

Predicted anomaly maps.

Anomaly Map Generator for CFlow model implementation.

#### class

```
anomalib.models.image.cflow.anomaly_map.AnomalyMapGenerator(pool_tayers)
```

```
Bases: Module
```

Generate Anomaly Heatmap.

```
compute_anomaly_map(distribution, height, width, image_size)
```

Compute the layer map based on likelihood estimation.

#### **Parameters:**

- distribution (list[torch.Tensor]) List of likelihoods for each layer.
- **height** (*list[int]*) List of heights of the feature maps.
- width (list[int]) List of widths of the feature maps.
- **image\_size** (*tuple[int, int]* | *torch.Size* | *None*) Size of the input image.

## **Return type:**

Tensor

#### **Returns:**

Final Anomaly Map

# forward(\*\*kwargs)

Return anomaly\_map.

Expects distribution, height and 'width' keywords to be passed explicitly

#### **Example**

```
>>> anomaly_map_generator = AnomalyMapGenerator(image_size=tuple(hparams.mode
>>> pool_layers=pool_layers)
>>> output = self.anomaly_map_generator(distribution=dist, height=height, widen)
```

#### **Raises:**

**ValueError** – distribution, height and 'width' keys are not found

#### **Returns:**

anomaly map

# **Return type:**

torch.Tensor





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