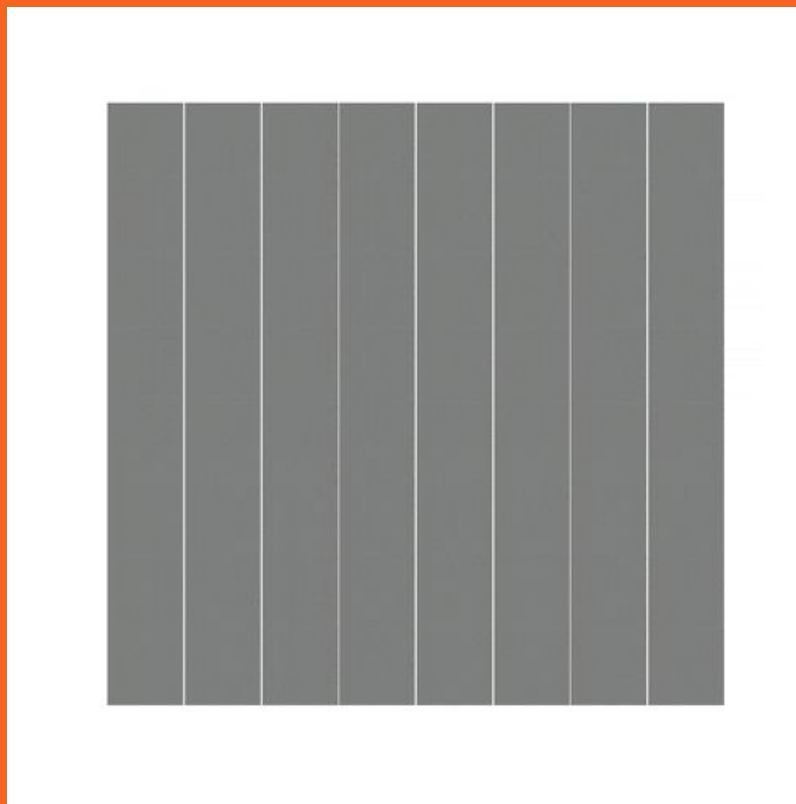

CANimals

Yarne Hermann and Jose Ronaldo Pinheiro Carneiro Filho

**Goal: generate
new categories
of animals**

**Start from dog
breeds**



Dogs generated with DCGAN

Creativity

Novelty is the difference of the piece relative to similar pieces.

Surprisingness is the difference between what the viewer expects and what the viewer sees.

Complexity refers to the amount of independent stimuli in a piece.

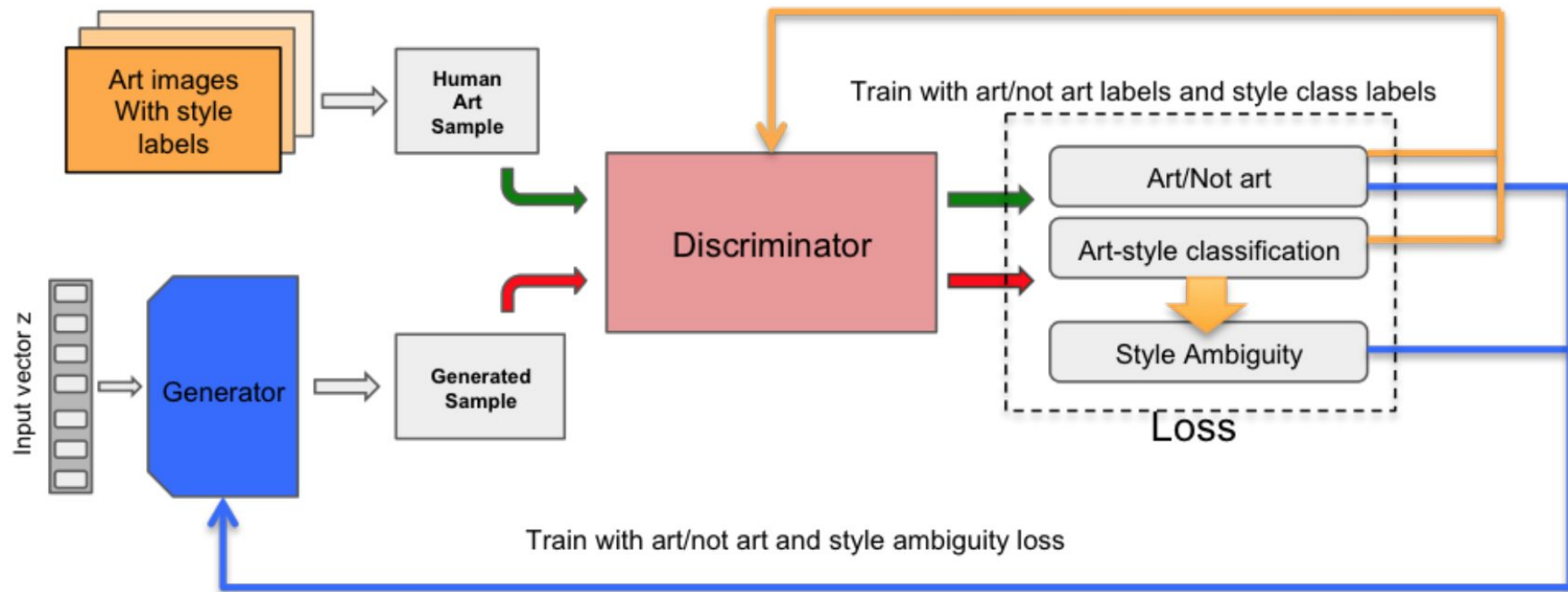
Ambiguitiy refers to the conflict between the semantic and syntactic information of the piece.

Puzzlingness refers to the conflict between disparate meanings in a piece.

CAN

How it works?

DCGAN with modified losses to induce creativity in generation of paintings by increasing Novelty and Surprisingness



Algorithm 1 CAN training algorithm with step size α , using mini-batch SGD for simplicity.

- 1: **Input:** mini-batch images x , matching label \hat{c} , number of training batch steps S
 - 2: **for** $n = 1$ **to** S **do**
 - 3: $z \sim \mathcal{N}(0, 1)^Z$ {Draw sample of random noise}
 - 4: $\hat{x} \leftarrow G(z)$ {Forward through generator}
 - 5: $s_D^r \leftarrow D_r(x)$ {real image, real/fake loss }
 - 6: $s_D^c \leftarrow D_c(\hat{c}|x)$ {real image, multi class loss}
 - 7: $s_G^f \leftarrow D_r(\hat{x})$ {fake image, real/fake loss}
 - 8: $s_G^c \leftarrow \sum_{k=1}^K \frac{1}{K} \log(p(c_k|\hat{x})) + (1 - \frac{1}{K})(\log(p(c_k|\hat{x})))$ {fake image Entropy loss}
 - 9: $\mathcal{L}_D \leftarrow \log(s_D^r) + \log(s_D^c) + \log(1 - s_G^f)$
 - 10: $D \leftarrow D - \alpha \partial \mathcal{L}_D / \partial D$ {Update discriminator}
 - 11: $\mathcal{L}_G \leftarrow \log(s_G^f) - s_G^c$
 - 12: $G \leftarrow G - \alpha \partial \mathcal{L}_G / \partial G$ {Update generator}
 - 13: **end for**
-

Dataset

Stanford Dogs

20,579 images (removed 1 image)

120 different dog breeds (classes)

Rescaled images to 128, 128

Cleaned but not augmented

Approach

1. Implemented CAN paper and tested on Stanford Dogs:
 - Errors, particularly with the loss
 - Ran but loss got stuck, images bad
 2. Ran our CAN as DCGAN for 1 dog breed:
 - Found & fixed errors
 3. Ran CAN for 10 dog breeds
-

CAN as DCGAN

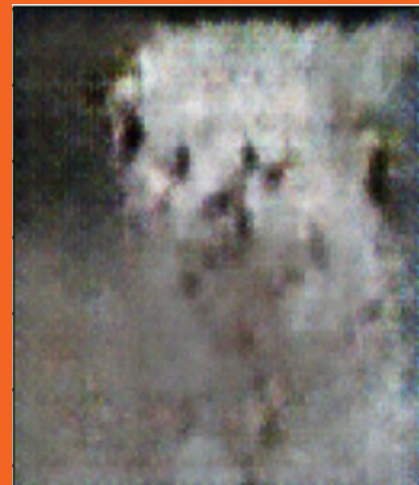
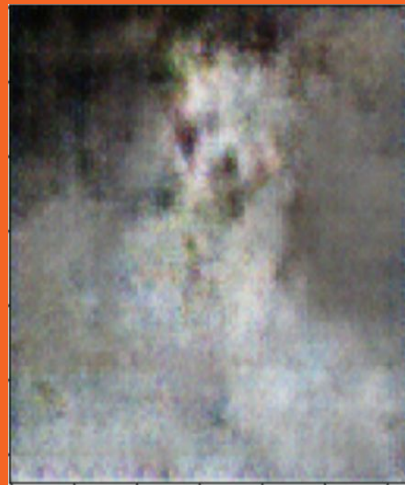
Maltese Dog

252 images

After 255 epochs:

Discriminator loss: 0.117

Generator loss: 4.277



CANines

10 Dogs

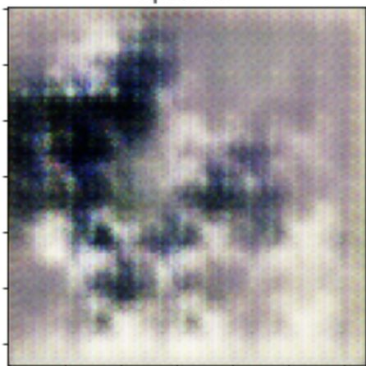
1760 images

Gets stuck at epoch 401

Discriminator loss: 0.0001

Generator loss: 21.97

epoch 30



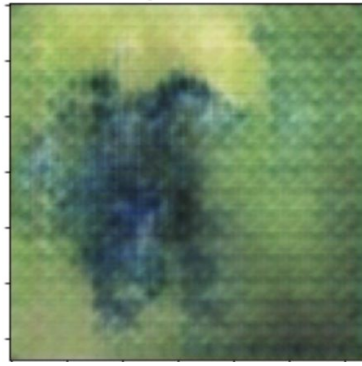
epoch 50



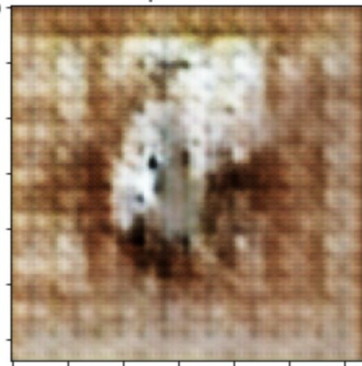
epoch 100



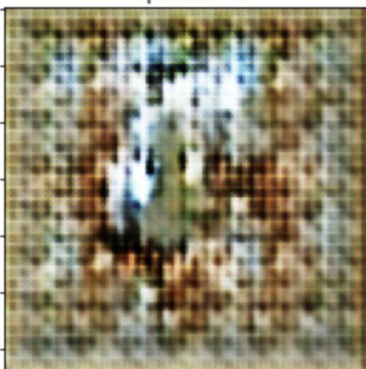
epoch 200



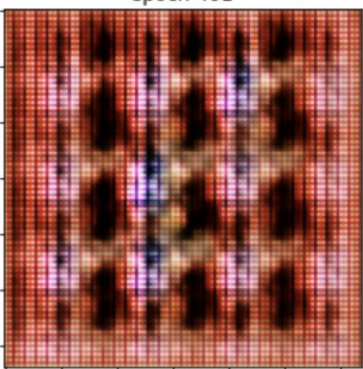
epoch 300



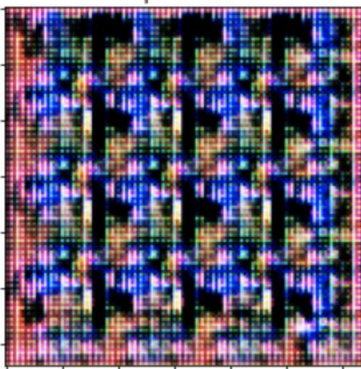
epoch 400



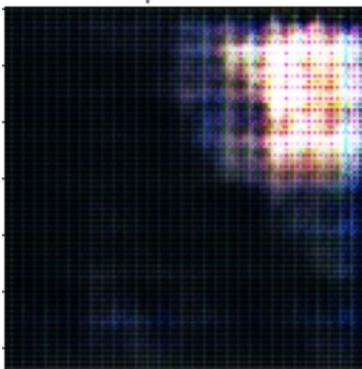
epoch 401



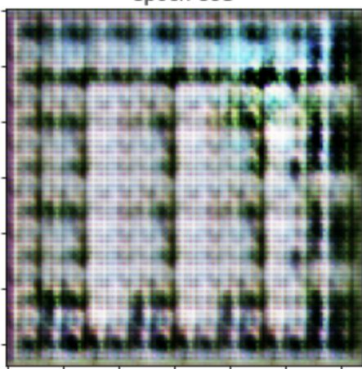
epoch 800



epoch 853



epoch 893



Future Work

Improve CANines 10: First train in DCGAN mode and then continue as CAN

Extend to full Stanford Dogs dataset

Extend to tree of life (our initial goal)
