

# Conditional CycleGAN for Attribute Guided Face Image Generation

published: 2017-05

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We are interested in realistic face image generation where facial attributes can be fully controlled in the automatic generation process.

With the proposed attribute-guided approach to face image generation, where the input consists of a low resolution face image and a set of face attributes during inference, we demonstrate the efficacy of our approach on identity-preserving face image super-resolution.

## Cycle GAN

$$L(G_{X \rightarrow Y}, G_{Y \rightarrow X}, D_X, D_Y) = L(G_{X \rightarrow Y}, D_Y) + L(G_{Y \rightarrow X}, D_X) + \lambda L_c(G_{X \rightarrow Y}, G_{Y \rightarrow X})$$

## Attribute Guided Conditional CycleGAN

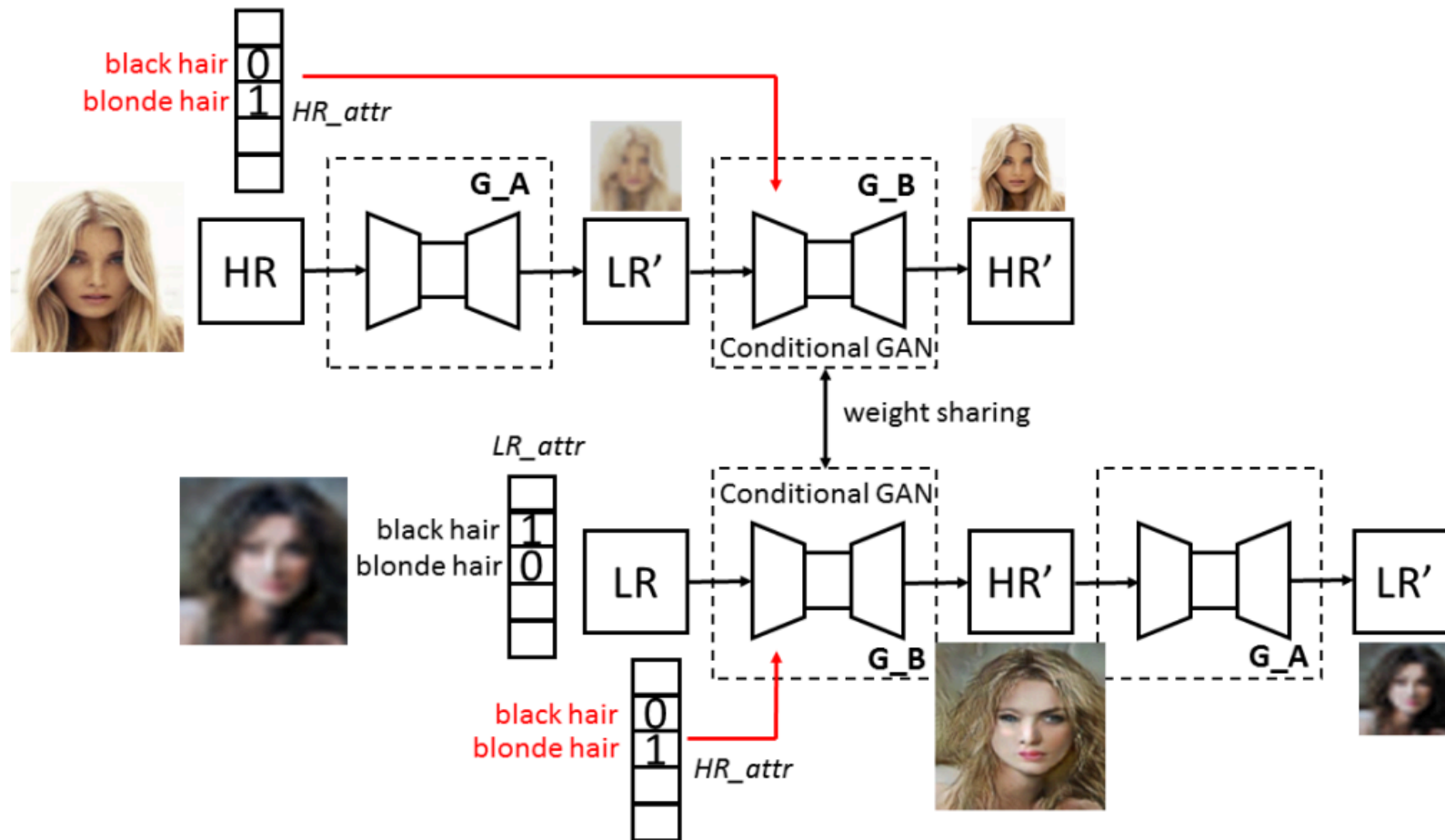
To include conditional constrain into the cycleGAN network, the adversarial loss is modified to include the conditional feature vector as part of the input of the generator and discriminator as:

$$L(G_{(X,Z) \rightarrow Y}, D_Y) = \min_{\Theta_g} \max_{\Theta_d} E_{y,z} [\log D_Y(y, z)] + E_{x,z} [\log(1 - D_Y(G_{(X,Z) \rightarrow Y}(x, z), z))]$$

**In our implementation, the conditional feature vector is first resized(using replicate) to match the image size of the input**

image which is downsampled into a low resolution image, with the intensity value of each feature map equal to the value of each column of the feature vector. Hence, for 18-dimensional feature vector, we have 18 homogeneous feature maps after resizing. The resized feature vector is then concatenated with the *conv1* layer of the generator network to propagate the inference of feature vector to the generated images. In the discriminator network, the resized feature vector is also concatenated with the *conv1* layer.

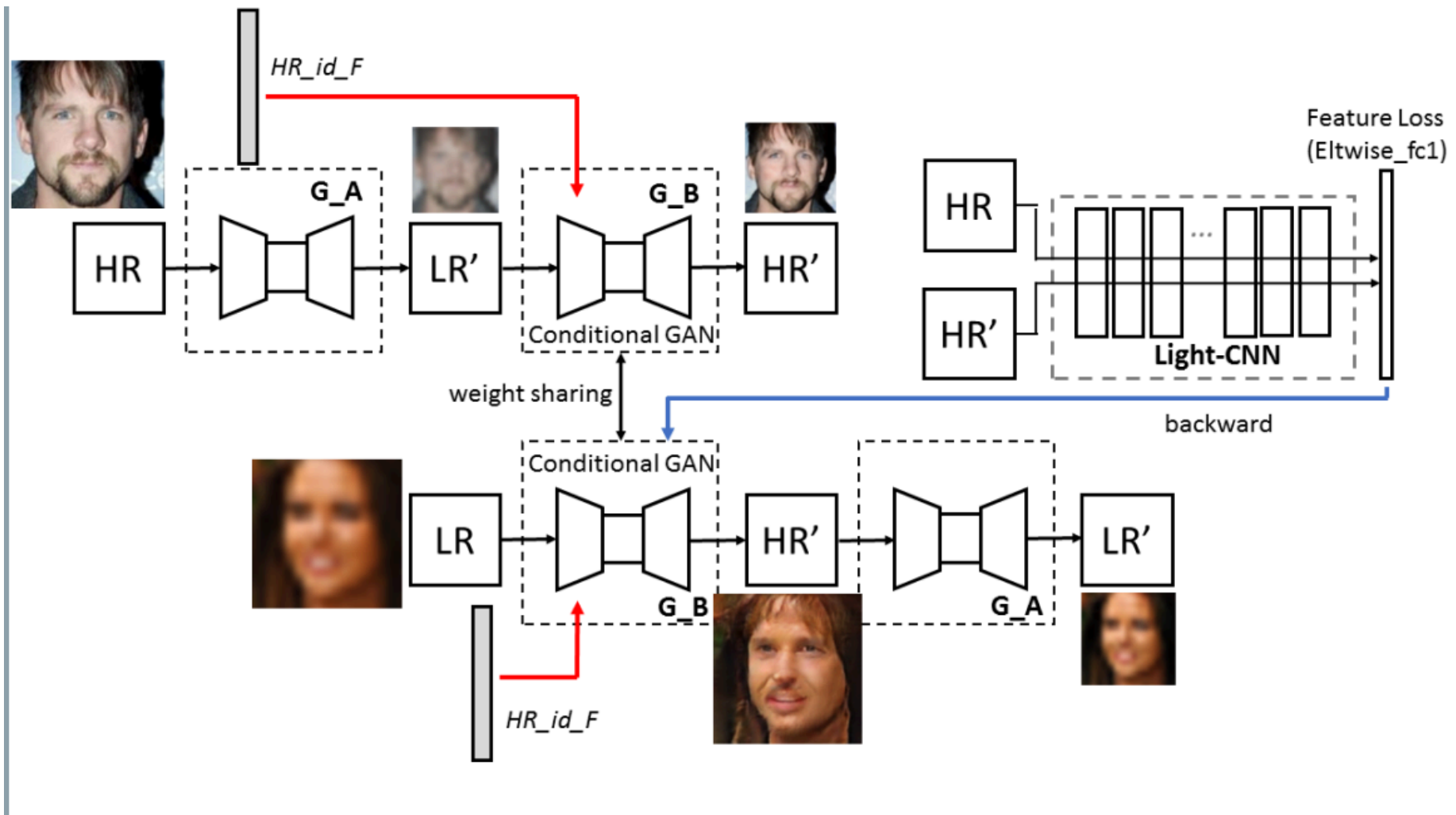
**Conditional CycleGAN for attribute guided face super-resolution**



We embed an additional attribute vector, and utilize conditional GAN to train a generator  $G_B$  to generate high resolution face

*image given the low resolution face image and the attribute vector as inputs.*

### **Conditional CycleGAN for identity preserving face super-resolution**



*We include additional face verification loss into the training process.*