Supplementary Material: DeepFace: Closing the Gap to Human-Level Performance in Face Verification

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Illustration of the SFC dataset

Examples of images assigned to the same identity are shown in Fig. 1, demonstrating the *SFC* dataset. Note that typically there is about 3% error in labeling.



Figure 1. Samples from SFC (permission granted).

Error visualization on the LFW

For our best performing result (97.35%) on *LFW*, given by *DeepFace-ensemble*, there are 99 false negatives and 60 false positives, all shown in Fig. 2 and Fig. 3.



Figure 2. The **99 False-Negative** pairs (1.65%) on *LFW* by *DeepFace-ensemble*. Borders were colored by the authors according to their *belief* with respect to what contributed to the misses: Aging (red), Sunglasses (green), Occlusions/hats (blue), Profile faces (purple), Dataset errata (yellow), and assorted (white). Note however, that since *LFW* is a collection of celebrities, then most likely that human were well "trained" to recognize them, in contrast to algorithms that report accuracy on *LFW* protocols, which are not provided with training samples of the same identities they are tested upon.



Figure 3. The **60 False-Positive** pairs (1.00%) on *LFW* by *DeepFace-ensemble*.

Error visualization on the YTF

For our best performing result with 92.5% on the *YTF* by *DeepFace-single*, there are 184 false negatives and 189 false positives. Samples are shown in Fig. 4 and Fig. 5.



Figure 4. Examples of false negatives on the YTF by DeepFace-single.



Figure 5. Examples of false positives on the *YTF* by *DeepFace-single*.

Feature vector sparsity visualization

Fig. 6 illustrates the sparsity of the face representation. The sparsity level measures the ratio of zeros out of the 4096 dimensions, i.e., a sparsity level of 80% corresponds to 3277 zeros and only 819 non-zero values.



Figure 6. Histogram of the face representation sparsity level on LFW

Training on the SFC

Fig. 7 shows the Train and Test average (minus-) log-probability observed during training on the SFC dataset, in epochs.



Figure 7. Train and Test errors observed during training on the SFC, over epochs

Source domain and Target domain distribution differences

Fig. 8 shows the age distribution of the training (*SFC*) and the testing (*LFW*) datasets. The age was estimated from faces automatically using an age estimator that incorporate an average error of 5 years.



Figure 8. Left: Histogram of the estimated-age on SFC (train). Right: Histogram of the estimated-age on LFW (test)