

# Label Denoising Adversarial Network (LDAN) for Inverse Lighting of Faces

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\*Equal contribution

# Applications

Lighting Transfer (Images from Zhixin Shu et.al., SIGGRAPH 2017):



Image Forensics:



→ Same lighting or not?

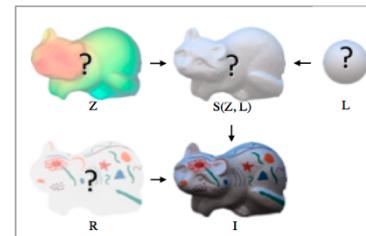
# Prior Art in Lighting Estimation

3DMM Fitting (*Blanz et al. SIGGRAPH 1999*)

$$\text{Image} \leftrightarrow \text{3D Face} = R_p \begin{pmatrix} \alpha_1 \cdot \text{Face}_1 + \alpha_2 \cdot \text{Face}_2 + \alpha_3 \cdot \text{Face}_3 + \alpha_4 \cdot \text{Face}_4 + \dots \\ \beta_1 \cdot \text{Face}_1 + \beta_2 \cdot \text{Face}_2 + \beta_3 \cdot \text{Face}_3 + \beta_4 \cdot \text{Face}_4 + \dots \end{pmatrix}$$

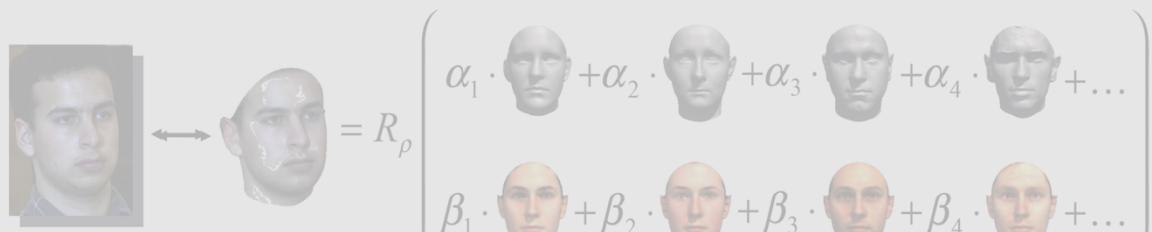
Intrinsic Image Decomposition (*Barron et al. PAMI 2015*)

$$\begin{aligned} & \underset{Z, R, L}{\text{minimize}} && g(R) + f(Z) + h(L) \\ & \text{subject to} && I = R + S(Z, L) \end{aligned}$$



# Prior Art in Lighting Estimation

3DMM Fitting (Blanz *et al.* SIGGRAPH 1999)


$$\text{target image} \leftrightarrow \text{3D face model} = R_p \begin{pmatrix} \alpha_1 \cdot \text{face}_1 + \alpha_2 \cdot \text{face}_2 + \alpha_3 \cdot \text{face}_3 + \alpha_4 \cdot \text{face}_4 + \dots \\ \beta_1 \cdot \text{face}_1 + \beta_2 \cdot \text{face}_2 + \beta_3 \cdot \text{face}_3 + \beta_4 \cdot \text{face}_4 + \dots \end{pmatrix}$$

Optimization Based

Slow

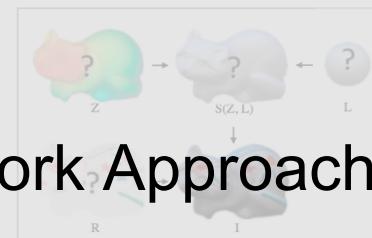
Poor Results on Low-Res

Intrinsic Image Decomposition (Barron *et al.* PAMI 2015)

$$\underset{Z, R, L}{\text{minimize}} \quad g(R) + f(Z) + h(L)$$

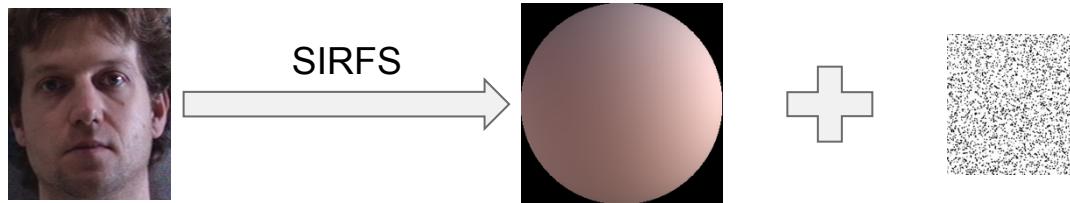
subject to

A Neural Network Approach?

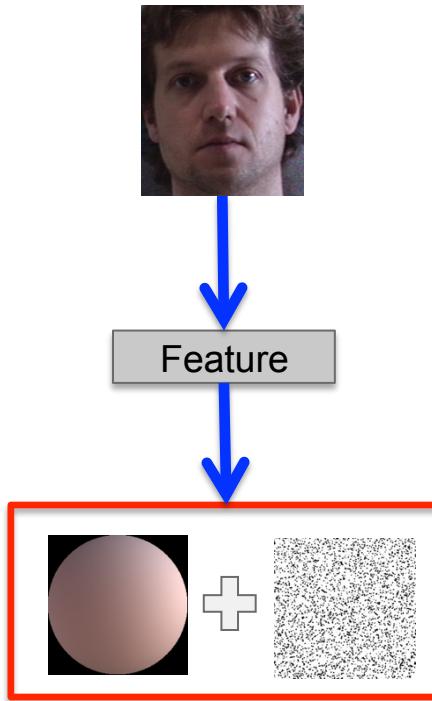


# Label Denoising Adversarial Network

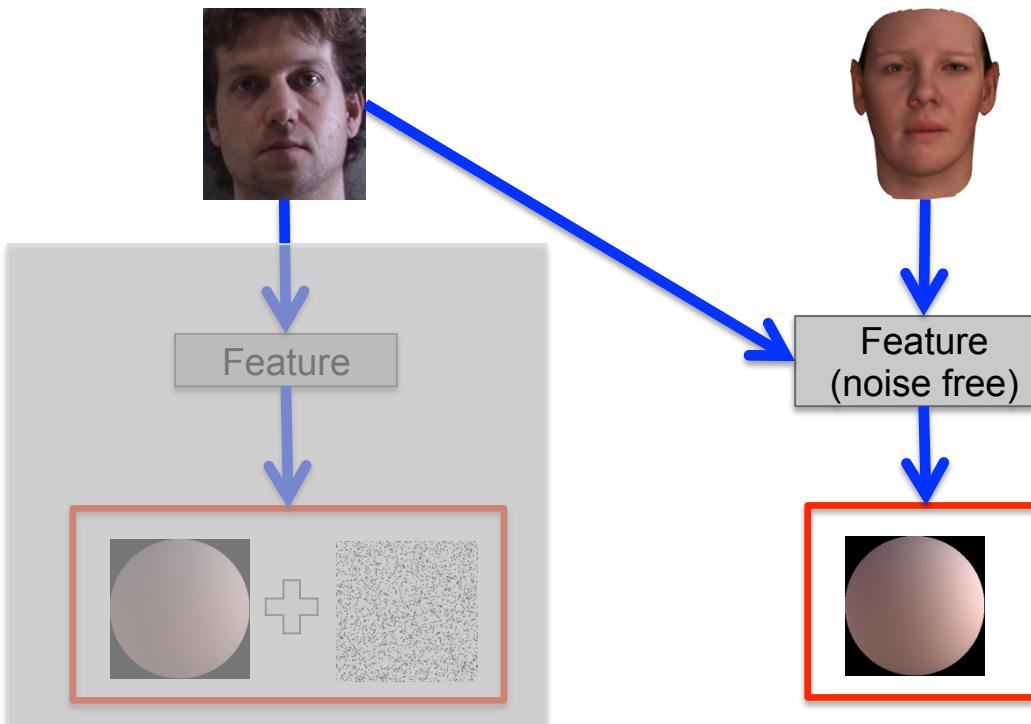
Use SIRFS (Barron *et al.* PAMI 2015) for “noisy labels”



# Synthetic Data to “Denoise” the Labels

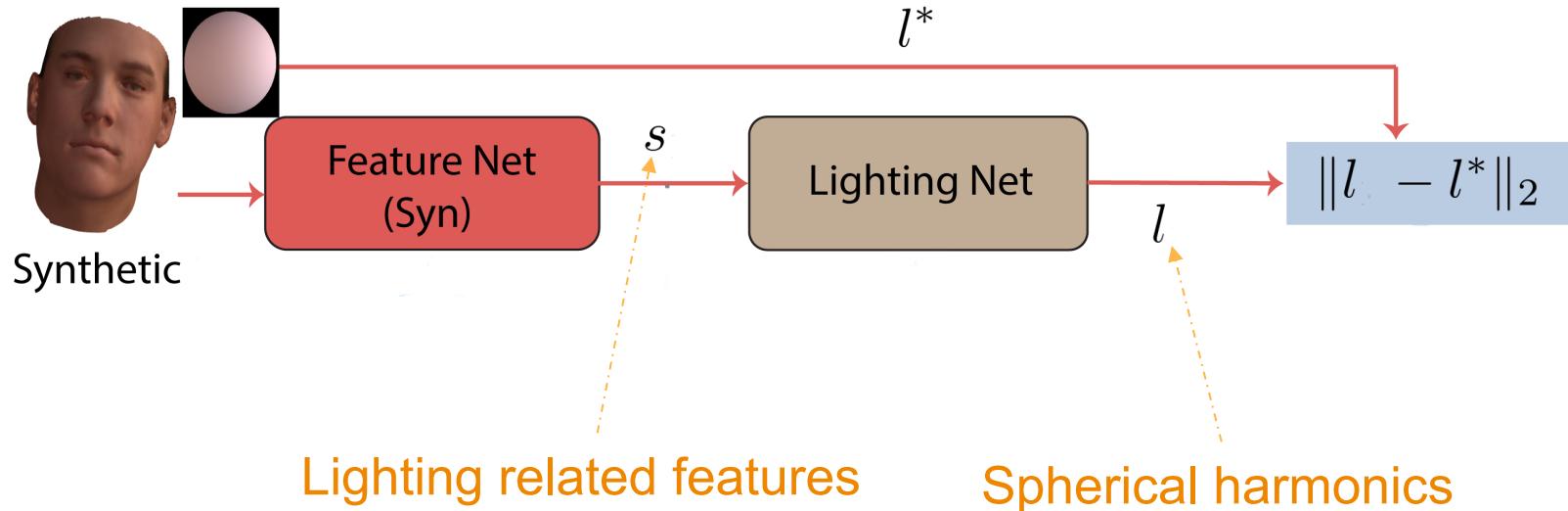


# Synthetic Data to “Denoise” the Labels



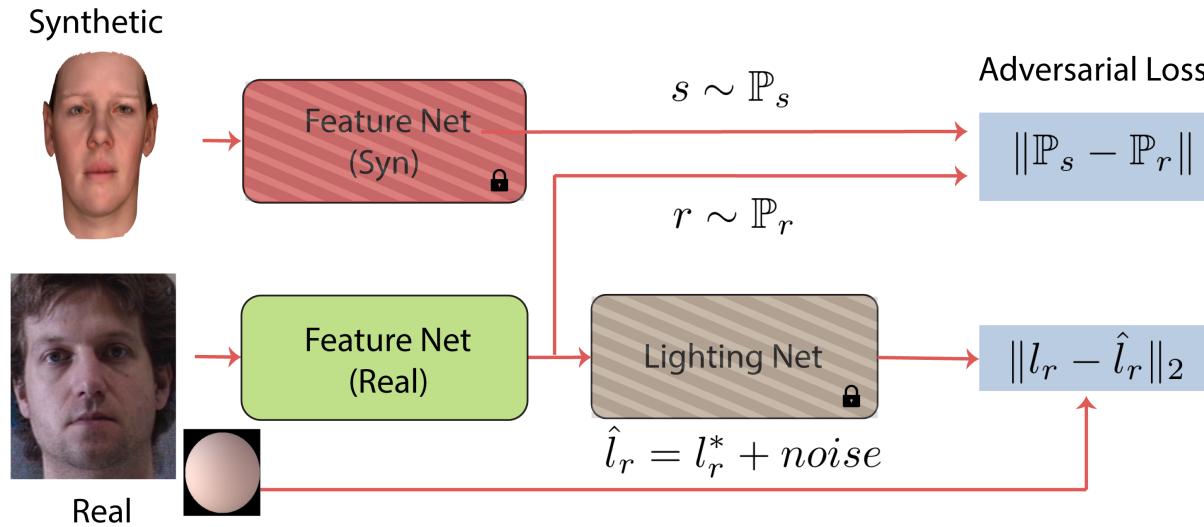
# Label Denoising Adversarial Network

Step 1



# Label Denoising Adversarial Network

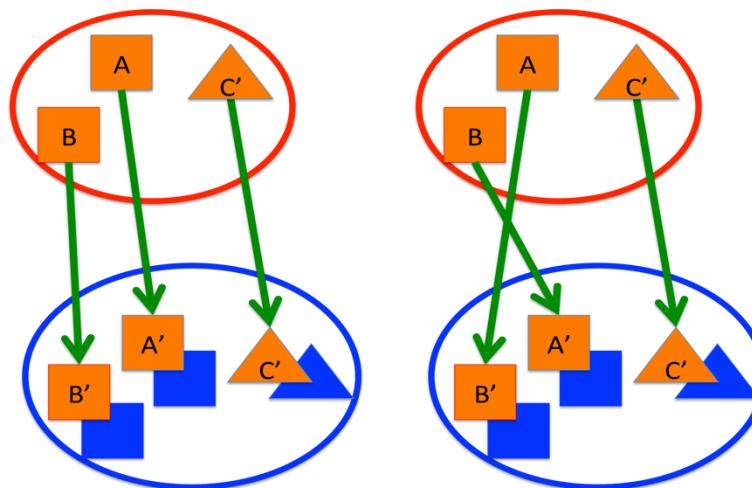
## Step 2



# Label Denoising Adversarial Network

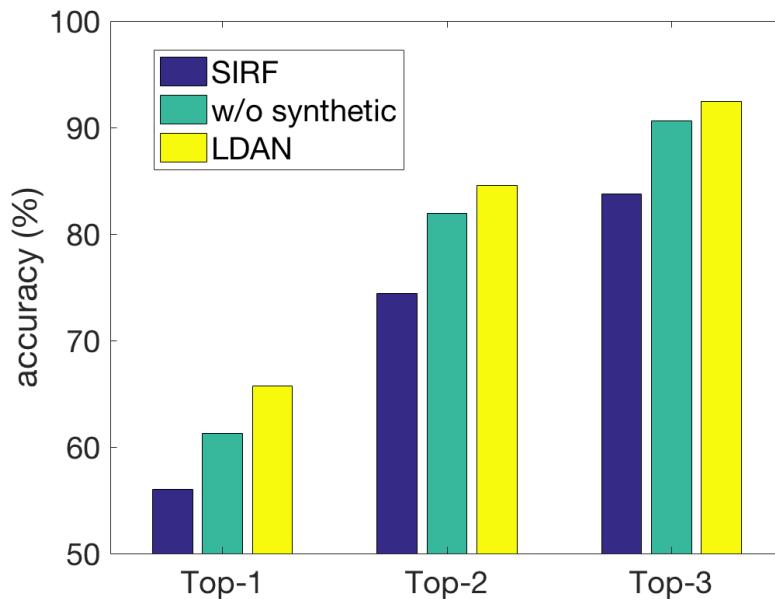
Toy example of mapping features of real faces to features of synthetic faces

- Classification: both are the same
- Regression: only one is correct

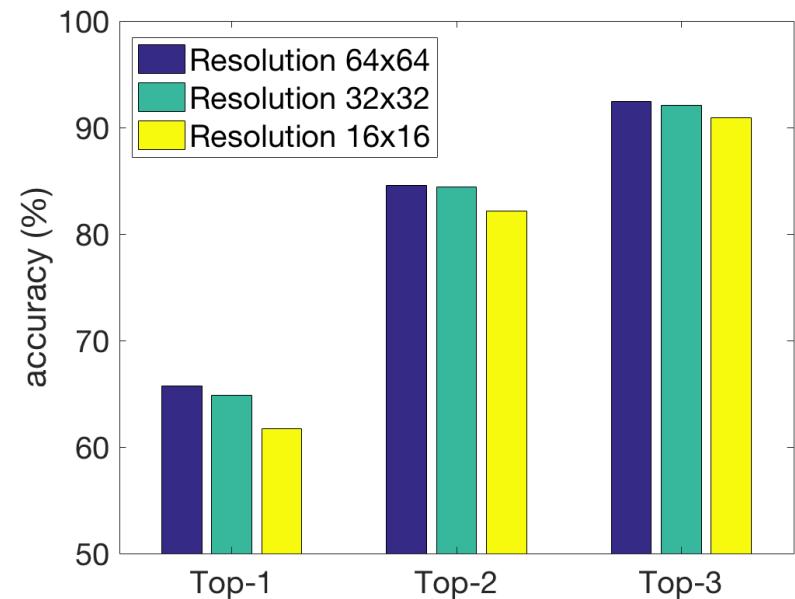


# Lighting Classification Result on MultiPIE

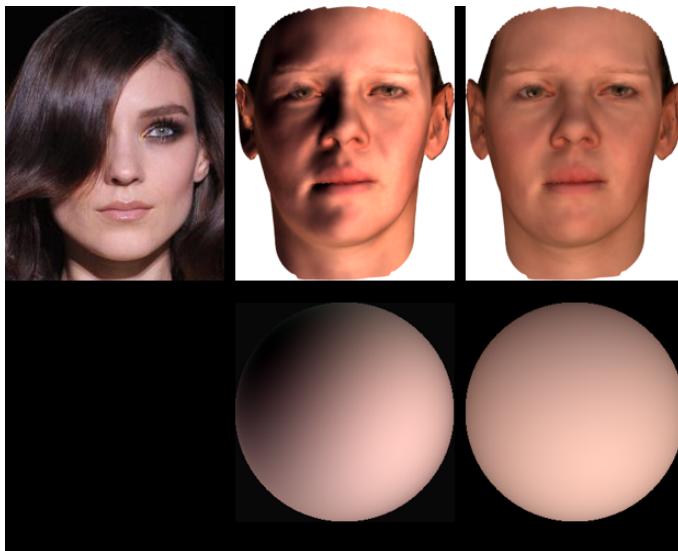
Comparison with Baseline



Low-Res Robustness

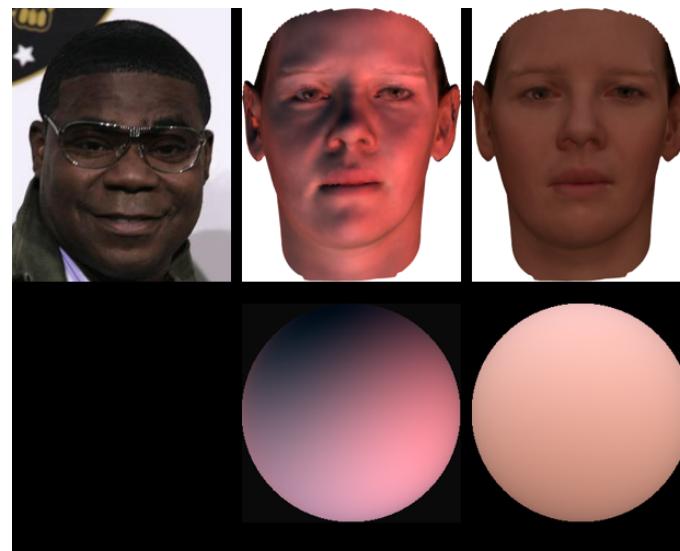


# Qualitative Result



SIRFS

LDAN



SIRFS

LDAN

Comments?  
Questions?

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