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Asymmetric Feature Generation and Matching in Images

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Problem Background

Consider a real-life scenario: Can we match individuals from two sets of similar images?

Figure: The Same Twin from Different Perspectives

- For strangers, it is **difficult** to match individuals in the two images.
- For their family members, it is **easy to identify** the corresponding individuals at a glance.

Asymmetric Feature Matching Problem

- How to generate a set of images that appear similar to attackers but can be matched by defenders?
  - Unlike traditional feature point matching, pre-trained models are often sufficient for image feature matching in most cases.(SIFT,deep learning...)
  - Asymmetric features.

Applications: Current UAV navigation and control algorithms rely on GPS signals and cannot achieve local positioning.

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Problem Formulation and Solution

First, consider only two perspectives and generate data from a single original image A. The first perspective data is given by:

$$D_1 = A + \Delta_1 + w_1, \ldots, D_m = A + \Delta_m + w_m,$$

and the second perspective data is given by:

$$E_1 = A + \Delta_1 + \zeta_1, \ldots, E_m = A + \Delta_m + \zeta_m.$$

Can we derive the optimal linear transformation F to facilitate matching of the original image set?

Difficult for Attackers to Match

The goal is to minimize the maximum difference between perturbations:

$$\min_{F, \Delta_1, \ldots, \Delta_m} \max_{i \neq j} ||\Delta_i - \Delta_j||.$$

Easy for Defenders with Knowledge of the Transformation Matrix

For defenders who know the transformation matrix F, the following condition ensures correct matching:

$$\forall i \neq j, ||B_i - C_i||_F < ||B_i - C_j||_F,$$

which implies:

$$||F(w_i - \zeta_i)||_F < ||F(\Delta_i - \Delta_j) + F(w_i - \zeta_j)||_F,$$

and further:

$$||F(w_i - \zeta_i)||_F + ||F(w_i - \zeta_j)||_F < ||F(\Delta_i - \Delta_j)||_F.$$

Thank You!