



Attribute-Image Person Re-identification via Modal-Consistent Metric Learning

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Received: 4 June 2022 / Accepted: 16 June 2023 / Published online: 9 July 2023
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Abstract

Attribute-image person re-identification (AIPR) is a cross-modal retrieval task that searches person images who meet a list of attributes. Due to large modal gaps between attributes and images, current AIPR methods generally depend on cross-modal feature alignment, but they do not pay enough attention to similarity metric jitters among varying modal configurations (i.e., attribute probe vs. image gallery, image probe vs. attribute gallery, image probe vs. image gallery, and attribute probe vs. attribute gallery). In this paper, we propose a modal-consistent metric learning (MCML) method that stably measures comprehensive similarities between attributes and images. Our MCML is with favorable properties that differ in two significant ways from previous methods. First, MCML provides a complete multi-modal triplet (CMMT) loss function that pulls the distance between the farthest positive pair as close as possible while pushing the distance between the nearest negative pair as far as possible, independent of their modalities. Second, MCML develops a modal-consistent matching regularization (MCMR) to reduce the diversity of matching matrices and guide consistent matching behaviors on varying modal configurations. Therefore, our MCML integrates the CMMT loss function and MCMR, requiring no complex cross-modal feature alignments. Theoretically, we offer the generalization bound to establish the stability of our MCML model by applying on-average stability. Experimentally, extensive results on PETA and Market-1501 datasets show that the proposed MCML is superior to the state-of-the-art approaches.

Keywords Modal-consistency · Triplet loss · Attribute-image person re-identification

Communicated by Suha Kwak, Ph.D.

This work was supported in part by the National Key R&D Program of China under the Grant of 2021YFE0205400, in part by the National Natural Science Foundation of China under the Grants 61976098 and 62002090, in part by the Natural Science Foundation for Outstanding Young Scholars of Fujian Province under the Grant 2022J06023.

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1 Introduction

Attribute-image person re-identification (AIPR) aims (Li et al., 2015a; Andrew et al., 2013; Yin et al., 2018; Cao et al., 2020; Lin et al., 2021) to retrieve a set of person images according to a given attribute query (e.g., gender, age, clothing, or accessories). Compared to the common image-based

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