Camouflaged Object Segmentation with Omni Perception

Haiyang Mei¹ · Ke Xu² · Yunduo Zhou¹ · Yang Wang¹ · Haiyin Piao³ · Xiaopeng Wei¹ · Xin Yang¹

Received: 28 May 2022 / Accepted: 12 June 2023 / Published online: 12 July 2023 © The Author(s), under exclusive licence to Springer Science+Business Media, LLC, part of Springer Nature 2023

Abstract

Camouflaged object segmentation (COS) is a very challenging task due to the deceitful appearances of the candidate objects to the noisy backgrounds. Most existing state-of-the-art methods mimic the first-positioning-then-focus mechanism of predators, but still fail in positioning camouflaged objects in cluttered scenes or delineating their boundaries. The key reason is that their methods do not have a comprehensive understanding of the scene when they spot and focus on the objects, so that they are easily attracted by local surroundings. An ideal COS model should be able to process local and global information at the same time, *i.e.*, to have omni perception of the scene through the whole process of camouflaged object segmentation. To this end, we propose to learn the omni perception for the first-positioning-then-focus COS scheme. Specifically, we propose an omni perception network (OPNet) with two novel modules, *i.e.*, the pyramid positioning module (PPM) and dual focus module (DFM). They are proposed to integrate local features and global representations for accurate positioning of the camouflaged objects and focus on their boundaries, respectively. Extensive experiments demonstrate that our method, which runs at 54 fps, significantly outperforms 15 cutting-edge models on 4 challenging datasets under 4 standard metrics. The code will be made publicly available.

Keywords Camouflage · Segmentation · Perception · Attention

Communicated by Karteek Alahari, Ph.D.

Xin Yang xinyang@dlut.edu.cn

Haiyang Mei haiyang.mei@outlook.com

Ke Xu kkangwing@gmail.com

Yunduo Zhou 1227627334@mail.dlut.edu.cn

Yang Wang yangwang06@mail.dlut.edu.cn

Haiyin Piao haiyinpiao@mail.nwpu.edu.cn

Xiaopeng Wei xpwei@dlut.edu.cn

¹ Dalian University of Technology, Dalian, China

² City University of Hong Kong, Hong Kong, China

³ Northwestern Polytechnical University, Xi'an, Shaanxi, China

1 Introduction

Creatures evolve complex camouflage mechanisms (e.g., protective coloration and mimicry) to harmonize themselves with the surroundings in order to escape from the predators or approach to the preys. Hence, detecting camouflaged objects is very challenging. On the other hand, the camouflaged object segmentation (COS) is an essential vision task as it can facilitate many down-stream applications, such as medical diagnosis, locust invasion protection, and search-and-rescue mission.

Motivated by the predation mechanisms in the nature, many COS methods (Fan et al., 2020a; Mei et al., 2021b; Fan et al., 2021a; Mei et al., 2023b) are proposed to follow the first-positioning-then-focus paradigm to detect camouflaged objects. However, these methods typically fail in positioning camouflaged objects in cluttered scenes (see the top row of Fig. 1) or delineating the accurate boundaries of camouflaged objects (see the bottom row of Fig. 1). The main reason is that these methods tend to make decisions based on region-level contexts. We observe that apex predators typically have both excellent frontal and side views in order to search and spot the targets. Hence, an ideal COS model should be able to

