- APPLICATION PROBLEMS
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Tracking People in Video Using Neural Network Features and Facial Identification Taking into Account the Mask Mode

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Abstract

Detection and tracking of people in video in distributed video surveillance systems is a difficult task, which has become even more complicated in the conditions of the mask mode, when some people may be wearing masks. To solve this problem, the paper proposes algorithms for detecting masked people and further tracking them using facial recognition systems based on neural networks. To train a neural network to detect masked faces, an approach is proposed that involves applying masks to faces from existing data sets, which makes it possible to expand the training sample and increase the accuracy of recognition of masked faces. The features of masked faces are used to establish the correspondence of people in the frames. This makes it possible to increase the efficiency of detection and tracking upon hiding of people behind objects of the background, high similarity of external features of several people, and analysis of the trajectories of their movement. Examples of detection and tracking of people are shown and appropriate recommendations are given.

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REFERENCES

1. A. Alzu'bi, F. Albalas, T. Al-Hadhrami, L. Bani Younis, and A. Bashayreh, "Masked face recognition using deep learning: A review," Electronics **10**, 2666 (2021). <u>https://doi.org/10.3390/electronics10212666</u>

Article Google Scholar

 R. Bohush, G. Ma, Ya. Weichen, and S. Ablameyko, "Object detection in video surveillance based on multiscale frame representation and block processing by a convolutional neural network," Pattern Recognit. Image Anal. 32, 1–10 (2022). <u>https://doi.org/10.1134/S1054661822010035</u>

Article Google Scholar

3. P. Charles, S. Jasmine Sultana, P. Hemalatha, and E. Keerti, "Multiple person detection and tracking using convolutional neural network," Int. J. Adv. Res. Innovation **8**, 156–159 (2020).

Google Scholar

 H. Chen, R. Bohush, I. Kurnosov, G. Ma, Y. Weichen, and S. Ablameyko, "Detection of appearance and behavior anomalies in stationary camera videos using convolutional neural networks," Pattern Recognit. Image Anal. 32, 254–265 (2022). <u>https://doi.org/10.1134/S1054661822020067</u>

Article Google Scholar

- 5. Ch. Chen, I. Kurnosov, G. Ma, Y. Weichen, and S. Ablameyko, "Masked face recognition using generative adversarial networks by restoring the face closed part," Opt. Mem. Neural Networks **32** (1) 1–13 (2023).
- Sh. Chen, Ya. Liu, X. Gao, and Zh. Han, "MobileFaceNets: Efficient CNNs for accurate real-time face verification on mobile devices," in *Biometric Recognition. CCBR 2018*, Ed. by J. Zhou, Yu. Wang, Zh. Sun, Zh. Jia, J. Feng, Sh. Shan, K. Ubul, and Zh. Guo, Lecture Notes in Computer Science, Vol. 10996 (Springer, Cham, 2018), pp. 428– 438. <u>https://doi.org/10.1007/978-3-319-97909-0_46</u>

Book Google Scholar

- F. Firdaus and R. Munir, "Masked face recognition using deep learning based on unmasked area," in *Second Int. Conf. on Power, Control and Computing Technologies (ICPC2T), Raipur, India, 2022* (IEEE, 2022), pp. 1–6. <u>https://doi.org/10.1109/ICPC2T53885.2022.9776651</u>
- G. Ciaparrone, F. L. Sánchez, S. Tabik, L. Troiano, R. Tagliaferri, and F. Herrera, "Deep learning in video multi-object tracking: A survey," Neurocomputing **381**, 61–88 (2020). <u>https://doi.org/10.1016/j.neucom.2019.11.023</u>

Article Google Scholar

 R. Golwalkar and N. Mehendale, "Masked-face recognition using deep metric learning and FaceMaskNet-21," Appl. Intell. 52, 13268–13279 (2022). <u>https://doi.org/10.1007/s10489-021-03150-3</u>

Article Google Scholar

- 10.Face Verification on Labeled Faces in the Wild. https://paperswithcode.com/sota/face-verification-on-labeled-faces-inthe. Cited October 16, 2022
- Face Verification on YouTube Faces DB. https://paperswithcode.com/sota/face-verification-on-youtube-facesdb. Cited October 16, 2022
- 12. U. Iqbal, A. Milan, and J. Gall, "PoseTrack: Joint multi-person pose estimation and tracking," in *Proc. IEEE Conf. on Computer Vision and Pattern Recognition (CVPR), Honolulu, Hawaii, 2017* (IEEE, 2017), pp. 4654–4663. <u>https://doi.org/10.1109/CVPR.2017.495</u>
- 13. K. Koide, E. Menegatti, M. Carraro, M. Munaro, and J. Miura, "People tracking and re-identification by face recognition for RGB-D camera networks," in *Proc. 2017 European Conf. on Mobile Robots (ECMR), Paris, 2017* (IEEE, 2017), pp. 1–7. https://doi.org/10.1109/ECMR.2017.8098689
- 14. Multiple Object Tracking Benchmark. https://motchallenge.net/. Cited October 16, 2022
- 15. P. Nagrath, R. Jain, A. Madan, R. Arora, P. Kataria, and J. Hemanth, "SSDMNV2: A real time DNN-based face mask detection system using single shot multibox detector and MobileNetV2," Sustainable Cities Soc. 66, 102692 (2021). <u>https://doi.org/10.1016/j.scs.2020.102692</u>

Article Google Scholar

- 16. F. Schroff, D. Kalenichenko, and J. Philbin, "FaceNet: A unified embedding for face recognition and clustering," in *Proc. IEEE Conf. on Computer Vision and Pattern Recognition, Boston, 2015* (IEEE, 2015), pp. 815–823. <u>https://doi.org/10.1109/CVPR.2015.7298682</u>
- 17. S. Sen and K. Sawant, "Face mask detection for covid_19 pandemic using pytorch in deep learning," IOP Conf. Series: Mater. Sci. Eng. 1070, 012061 (2021). <u>https://doi.org/10.1088/1757-</u> <u>899X/1070/1/012061</u>

Article Google Scholar

18.S. Sethia, M. Kathuria, and T. Kaushik, "Face mask detection using deep learning: An approach to reduce risk of Coronavirus spread," J. Biomed. Inf. **120**, 103848 (2021). <u>https://doi.org/10.1016/j.jbi.2021.103848</u>

Article Google Scholar

19.S. Singh, U. Ahuja, M. Kumar, K. Kumar, and M. Sachdeva, "Face mask detection using YOLOv3 and faster R-CNN models: COVID-19 environment," Multimedia Tools Appl. 80, 19753–19768 (2021). <u>https://doi.org/10.1007/s11042-021-10711-8</u>

Article Google Scholar

- 20. C. Szegedy, S. Ioffe, V. Vanhoucke, and A. A. Alemi, "Inception-v4, Inception-Resnet and the impact of residual connections on learning," Proc. AAAI Conf. Artif. Intell. **31**, 4278–4284 (2017). <u>https://doi.org/10.1609/aaai.v31i1.11231</u>
- 21.S. Ye, R. Bohush, C. Chen, I. Zakharova, and S. Ablameyko, "Person tracking and re-identification in video for indoor multi-camera surveillance systems," Pattern Recognit. Image Anal. **30**, 827–837 (2020). <u>https://doi.org/10.1134/S1054661820040136</u>

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Ethics declarations

The authors declare that they have no conflicts of interest.

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