

Chapter 8

Research Publications

- **Santosh Kumar** and Sanjay Kumar Singh, “Biometric Recognition for Pet animal”, *Journal of Software Engineering and Applications*, 7 (5), pp 470–484, 2014, [Google Scholar based Impact Factor : 1.16].
- **Santosh Kumar**, Shrikant Tiwari and Sanjay Kumar Singh, “ Face Recognition of Cattle: Can it be Done? ”, *Proceedings of the National Academy of Sciences, India Section A: Physical Sciences*, 86 (2), pp.137–148, 2016, [Impact Factor : 0.390].
- **Santosh Kumar**, Sanjay Kumar Singh, Ravi Shankar Singh, Amit Kumar Singh and Shrikant Tiwari, “Real-time recognition of cattle using animal biometrics ”, *Journal of Real-Time Image Processing*, pp. 1–12, 2016, [Impact Factor : 1.564].
- **Santosh Kumar** , Sanjay Kumar Singh and Amit Kumar Singh, “A Muzzle Point Pattern based Techniques for Individual Cattle Identification ”, *IET Image Processing*, 2016, [Impact Factor : 1.048].
- **Santosh Kumar** and Sanjay Kumar Singh, “Visual Animal Biometrics: Survey ”, *IET Biometrics*, pp. 1–38, 2016, doi: 10.1049/iet-bmt.2016.0017, [Impact Factor : 0.875].
- **Santosh Kumar** and Sanjay Kumar Singh, “Automatic identification of cattle using muzzle point pattern: a hybrid feature extraction and classification paradigm” , *Multimedia Tools and Applications*, pp. 1–38, 2016, doi:10.1007/s11042-016-4181-9, [Impact Factor : 1.34].

- **Santosh Kumar** and Sanjay Kumar Singh, “Monitoring of Pet Animal in Smart Cities using Animal Biometrics”, *Future Generation Computer Systems*, 2016, doi: 10.1016/j.future.2016.12.006, [Impact factor : 2.335].
- **Santosh Kumar**, and Sanjay Kumar Singh, “Cattle Recognition: A New Frontier in Visual Animal Biometrics Research ”, *Proceedings of the National Academy of Sciences, India Section A: Physical Sciences*, [under review].
- **Santosh Kumar**, and Sanjay Kumar Singh, “Deep Learning Framework for Recognition of Cattle using Muzzle Point Image Pattern ”, *Measurement, Elsevier*, [under review].
- **Santosh Kumar** and Sanjay Kumar Singh, “ Face recognition for cattle ”, *2015 Third International Conference on Image Information Processing (ICIIP), Jaypee University, Solan, Himachal Pradesh, Wakanaghath, 2015*, pp. 65–72.
- **Santosh Kumar** and Sanjay Kumar Singh, T. Dutta and H.P Gupta, “Poster: a real-time cattle recognition system using wireless multimedia networks”, *In Proceedings of the 14th Annual International Conference on Mobile Systems, Applications, and Services (Mobicys–2016)*, Singapore, 2016, pp.48–48.
- **Santosh Kumar** and Sanjay Kumar Singh, T. Dutta and H.P Gupta, “A Fast Cattle Recognition System using Smart devices”, *In Proceedings of the 2016 ACM on Multimedia Conference (ACM MM–2016)*, Amsterdam, The Netherlands, 15—19 October, 2016, pp.742–743.
- **Santosh Kumar**, Sanjay K. Singh,“Feature Selection and Recognition of Muzzle Pattern of Cattle by using Hybrid Chaos BFO and PSO Algorithms”, *Advances in Chaos Theory and Intelligent Control*, edited by Ahmad Taher Azar and Sundara-pandian Vaidyanathan, 2015.

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