



Innovation for Smart Dairy Farming

PRIN2017: Application of computer vision systems for herd management

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OBJECTIVES

Development of a computer vision system for:

- automatic detection and real-time monitoring of each cow
- monitoring and recording drinking behaviour data of each cow

EXPECTED RESULTS Definition of a new computer vision system based on deeplearning technique and evaluation of its performances



Materials and methods: neural network

- Darknet (Redmon, 2013), open source framework for neural network development including YOLO v3.
- Advantage to look at the whole image at test time: predictions informed by the global context
- YOLOv3 predicts an objectness score for each bounding box using logistic regression



Computer vision system for automatic detection and real-time monitoring of each cow





Materials and methods: study case

- Freestall barn with 72 milking and 8 dry cows, and 70 among calves and heifers.
- Cublicles with straw litter for lactating cows; straw bedding for dry and young animals.
- Videos recorded by HDR-CX115E (Sony) in a high quality standard (4k resolution, 25 fps)
- Fixed camera height 3.50 m; scene included 29 lactating cows.
- 210 min recorded; 25200 frames
- identify individual cows based on the piebald spotting pattern





1.0 AP=0.76 0.8 AP=0.74 **Precision** 0.6 **AP=Average** Precision 0.2 ----- original ---- augmented 0.0 0.0 0.2 0.4 0.6 0.8 1.0

Results

- By increasing the number of occurrences O_t until a certain "threshold", AP increases, then low slope
- good quadratic regression curve of the relationship between AP and O_txA_t : classes having

 $O_t x A_t > 8$, AP rapidly increases up to $O_t x A_t$ 12, then it becomes

almost constant

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Monitoring and recording drinking behaviour data of each cow

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Materials and methods: study case

- Regular rectangular barn (51x23 m);
- 78 beddings filled with sawdust and realized over three lanes
- Robot Lely Astronaut A3 Next
- Mechanic ventilation system + water soaker line activated on the basis of indoor THI
- The farm hosts 60-70 milking cows





The position of the camera was properly selected in order to guarantee the framing of a large area surrounding one of the drinking trough

Materials and methods: hardware equipment

- Camera Flir BFLY-PGE-31S4C-C with a 6mm lens
- Camera resolution: 3.2 megapixel
- Use of a protection case



The trussed steel frame supporting the camera

- 3 possible displacements of the camera (X,Y,Z)
- 3 different inclination around X,Y,Z axis of the camera



Hardware installation

BEFORE



NOW





First results



Detection of individual cows in the monitored area





First results



Pose classification: identification of the drinking behaviour





PHASE 1: detection of the heads





PHASE 2: classification of heads drinking/not drinking

PHASE 3: association head-body of drinking cows





Intermediate remarks (2° year of project)

- Computer vision is suitable to identify individual Frisian cows in a dairy barn based ٠ on their morphological appearance
- One camera can monitor a significant part of the barn and provide information for ٠ manifold animals
- A relation was found between detection precision and number of occurrences x frame area: useful to efficiently plan the imege acquisition to train the
- Data augmentation confirmed to be effective to improve performances of the ٠ network
- Computer vision can be applied to detect cows drinking ٠
- The identification of cows at the water trough and the detection of their heads is ٠ feasible with a computer vision approach



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PRIN2017: Smart Dairy Farming – innovative solutions for herd management



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