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# MÉMOIRE

En vue de l'obtention du diplôme de Master Filière: Informatique Spécialité: Ingéniérie des Systèmes Informatiques(ISI)

### Thème

REAL-TIME ON-BOARD COUNTING SYSTEM IN CROWDED SCENES

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### ABSTRACT

**Crowd counting** is a useful tool for situational awareness in public spaces. Automated crowd counting with videos and images is an interesting but difficult task that has attracted a lot of interest in computer vision. Different deep learning techniques have been developed recently to reach cutting-edge performance. Numerous features of the techniques that have been evolved throughout time cover model architecture, learning paradigm, computing complexity, input pipeline, accuracy gains, etc.

Many researchers are devoting to crowd counting, and many excellent works of literature and works have spurted out. These works usually aim to be be helpful for the development of crowd counting. However, the question we should consider is why and how they are effective for this task. In this paper, we have surveyed many works to comprehensively and systematically study the crowd counting models, mainly **CNNbased** density map estimation methods.

This thesis is aimed to categorize, analyze as well as provide the latest development and performance evolution in crowd counting using different **deep learning** techniques and methods that are published in journals and conferences over the past five years.

**Key words:** Crowd counting, CNNs, density estimation, evaluation metrics, loss functions, transformers.

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## DEDICATION

We sincerely dedicate this work to our great teacher **Mustapha Mechab** who died during the COVID-19 pandemic, may God bless him with heaven, he was a big influence for us and for countless people.

## ACRONYMES

**CNN** Convolution Neural Network. MCNN Multi-Column Neural Network. YOLO You Only Look Once. **SSD** Single Shot Detector. **MAE** Mean absolute error. **RMSE** Root Mean Squared Error. GAME Grid Average Mean Absolute Error. **MPAE** Mean Pixel-Level Absolute Error. **PSNR** Peak Signal to Noise Ratio. **SSIM** Structural Similarity Index Measure. **CSRNet** Congested Scene Recognition Network. **SANet** Scale Aggregation Network. **SPN** Scale Pyramid Network. MOPN Multi-scale optical flow pyramid network . **SDTNet** Spatiotemporal Dilated Convolution. TAN Temporal Aware Network. **IOU** Intersection over union. HOG Histogram of oriented gradients. **ROI** Region Of Interest.