

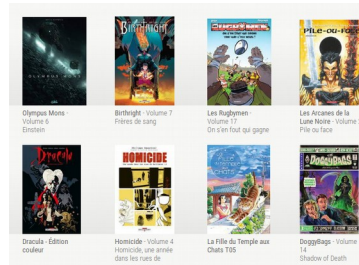
Sequential *Art image* Laboratory

Confidence criterion for speech balloon segmentation

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How to measure detection without GT?



Online
comic
bookstore

Balloon
segmentation

Method 1

Method 2

Method 3

Method N

Is this result
good enough?

Yes

Show interaction
to the reader

Highlighting,
Zoom,
Translation,
...

No



RELATED WORKS

Speech balloon segmentation



- + Xicheng Liu et al. 2015 [1]
 - Closed+**unclosed** balloons, clump splitting
 - Recall, precision, F1 score
- + Xueting Liu et al. 2016 [2]
 - Closed balloon (Manga), **text-aware** detection [3]
 - **Outside contour** detection
 - Recall, precision
- + C. Rigaud et al. 2017 [4]
 - Closed balloon (mixed styles)
 - Recall, precision, F1 + **confidence value**

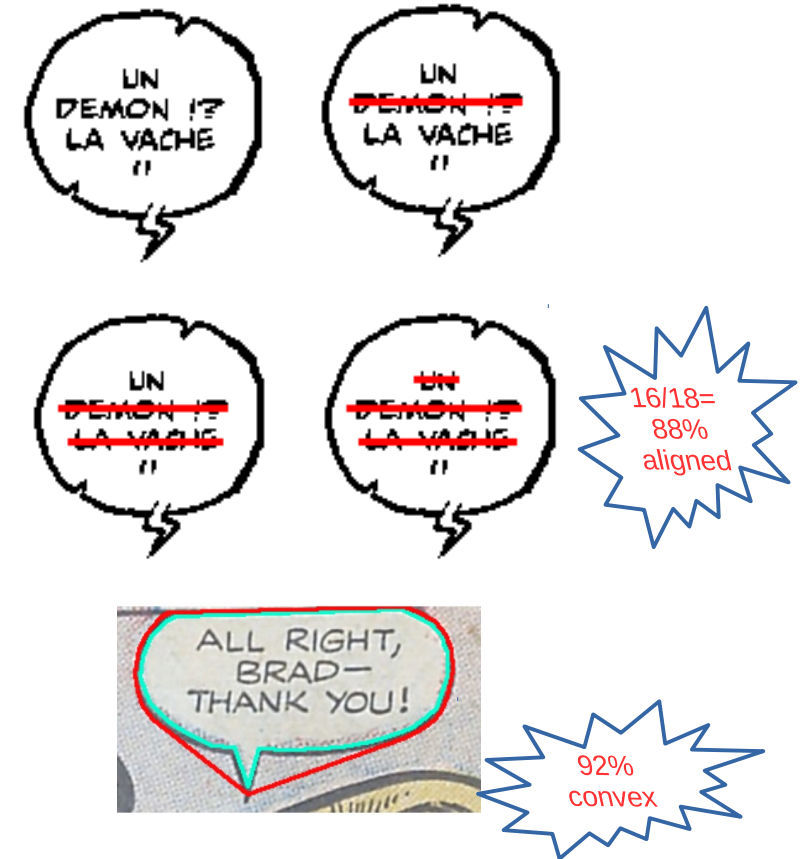
[1] X. Liu, Y. Wang, and Z. Tang, “**A clump splitting based method to localize speech balloons in comics**” in 13th International Conference on Document Analysis and Recognition (ICDAR), pp. 901–905, Aug 2015

[2] X. Liu, C. Li, H. Zhu, T.-T. Wong, and X. Xu, “**Text-aware balloon extraction from manga**” in The Visual Computer, vol. 32, no. 4, pp. 501–511, Apr 2016

[3] Epshtein, B., Ofek, E., Wexler, Y., “**Detecting text in natural scenes with stroke width transform**” in IEEE Conference on Computer Vision and Pattern Recognition (CVPR), pp. 2963–2970, 2010

Speech balloon segmentation

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[4] C. Rigaud, J.-C. Burie, and J.-M. Ogier, "Text-independent speech balloon segmentation for comics and manga" in Graphic Recognition. Current Trends and Challenges, Springer, pp. 133–147, 2017.

Speech balloon segmentation

+ D. Dubray et al. 2019 [5]

- Closed/**unclosed** balloons (illusory)
- Based on **U-Net** architecture + **VGG-16** encoder
- Recall, precision, F1 score

+ N.-V. Nguyen et al. 2019 [6]

- Closed/**unclosed** balloons (+ character/face/panel/narrative text/link)
- Region Proposal Network (**RPN**) + **Mask R-CNN**
- Recall, precision, F1 score

[5] D. Dubray and J. Laubrock (2019). « **Deep CNN-based Speech Balloon Detection and Segmentation for Comic Books** ». CoRR, abs/1902.08137. 2019.

[6] N.-V. Nguyen, C. Rigaud, and J.-C. Burie, « **Comic MTL: optimized multi-task learning for comic book image analysis** » International Journal on Document Analysis and Recognition (IJDAR), July 2019

PROPOSED APPROACH

Generic confidence value

S = balloon candidate contour

$$cShape = \frac{arcLength(hull(S))}{arcLength(S)}$$

[4]: $C = \alpha \times cAlign + \beta \times cShape$

[7]: $cLex = (1 - \text{mean Levenshtein distance per character ratio})$

Proposed: $C = \alpha \times cLex + \beta \times cShape$

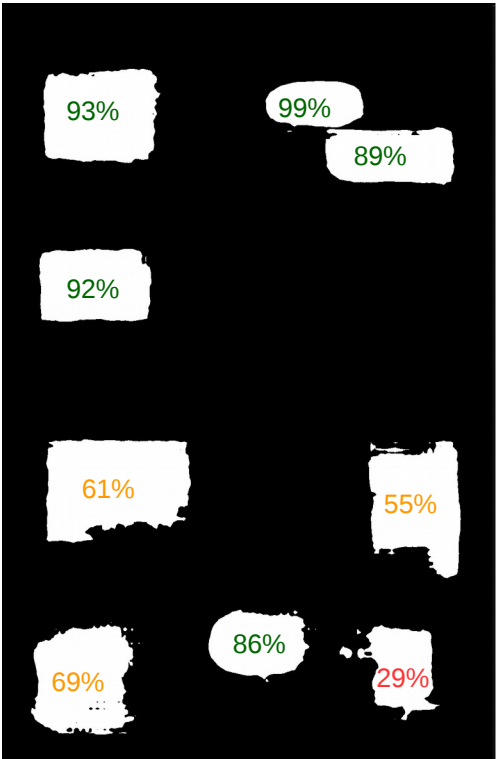
[4] C. Rigaud, J.-C. Burie, and J.-M. Ogier, "Text-independent speech balloon segmentation for comics and manga" in Graphic Recognition. Current Trends and Challenges, Springer, pp. 133–147, 2017.

[7] U. Springmann, F. Fink, and K. U. Schulz. "Automatic quality evaluation and (semi-) automatic improvement of mixed models for OCR on historical documents". CoRR, abs/1606.05157, 2016.

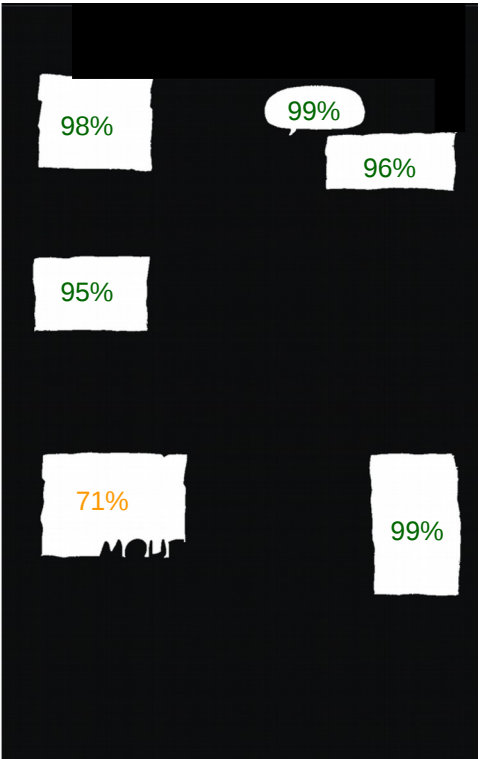
Example 1

OCR output	ALL RIGHT, BRAD !HANK you!	(i - . . ,
Confidence	<i>cShape</i> = 92% <i>cLex</i> = 95% (=19/20)	<i>cShape</i> = 22% <i>cLex</i> = 0%

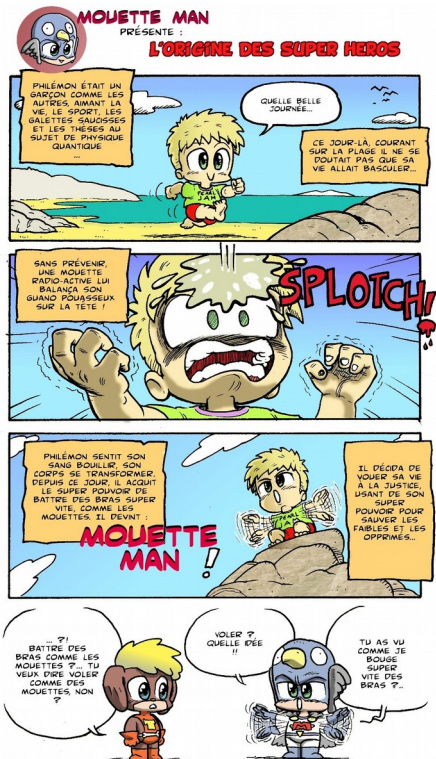
Example 2



NN-based approach



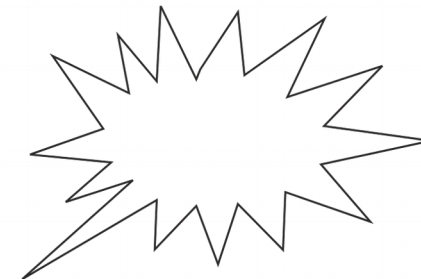
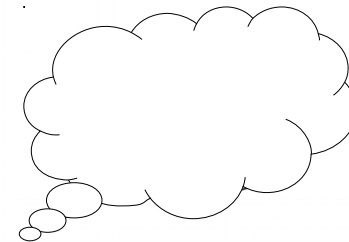
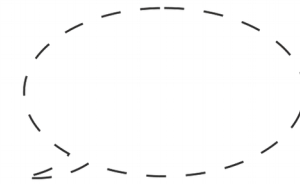
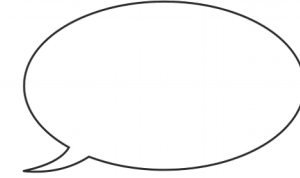
CC-based approach



Original image

CONCLUSION

- + Simple, fast and generic confidence criterion
- + Applications
 - Continuous quality control
 - Automatic GT for machine learning
- + Limitations
 - OCR/lexicon dependent
 - Whisper, thought, scream balloons
- + Future
 - Compare with previous/next balloons



THANK YOU!



<https://github.com/crigaud/publication/tree/master/2019/GREC/>