

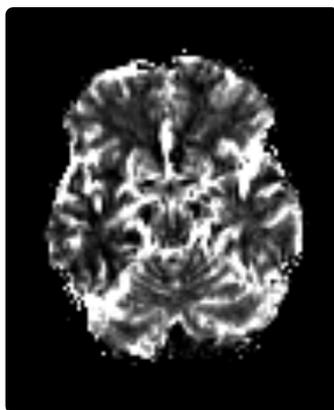
Robust perfusion maps in Arterial Spin Labeling by means of M-estimator



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DSC CBF



ASL CBF
Average



ASL CBF
Z-score



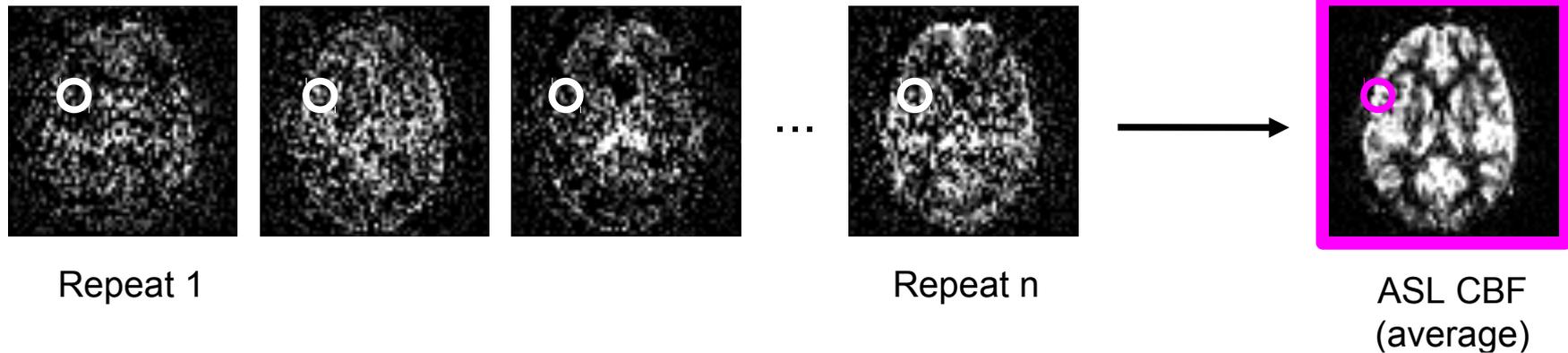
ASL CBF
M-estimator

Monitor 9

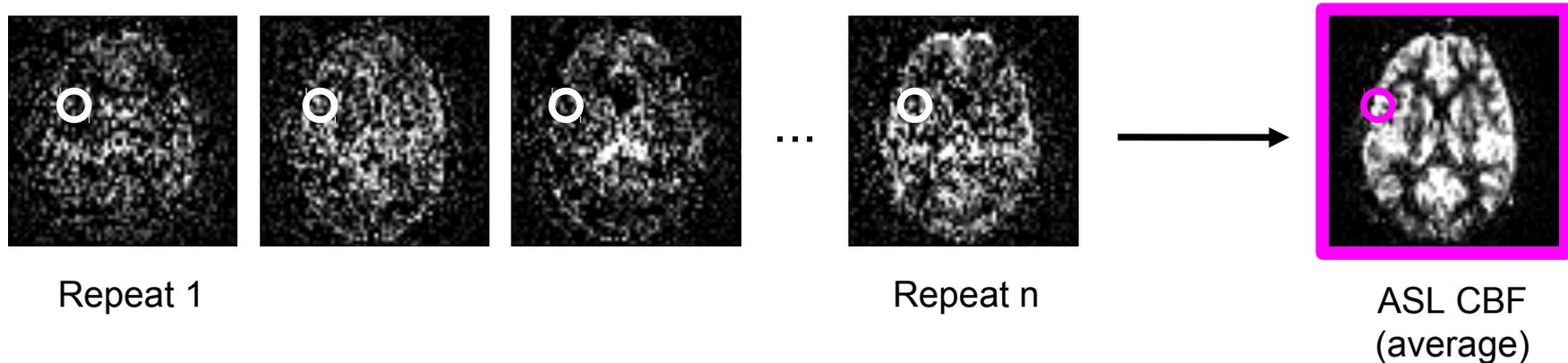




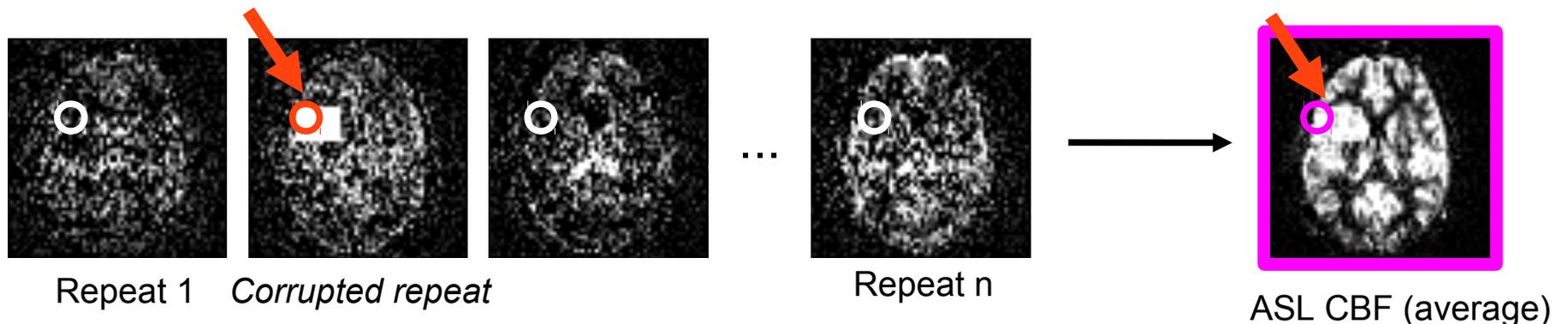
- In ASL, the acquisition is usually repeated several times and the perfusion information is calculated by averaging across the repetitions.



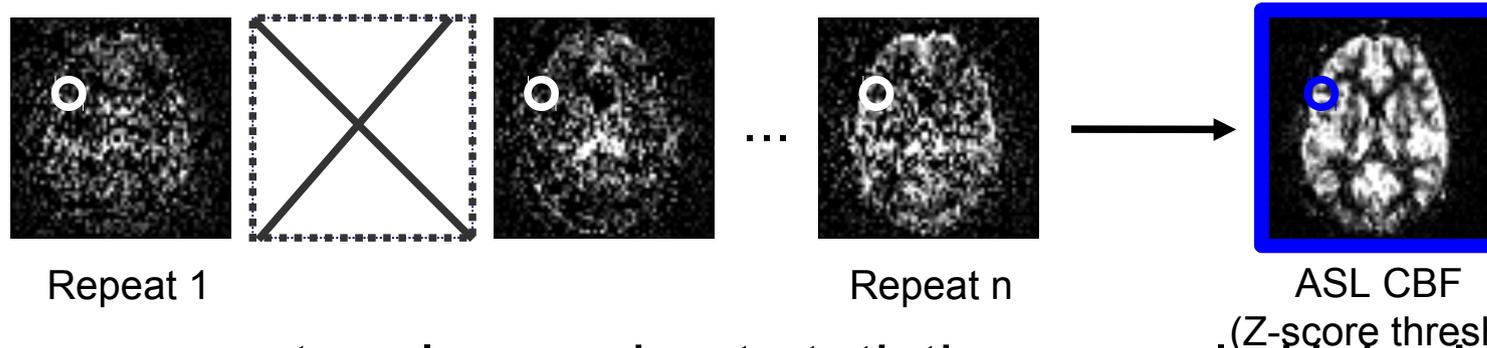
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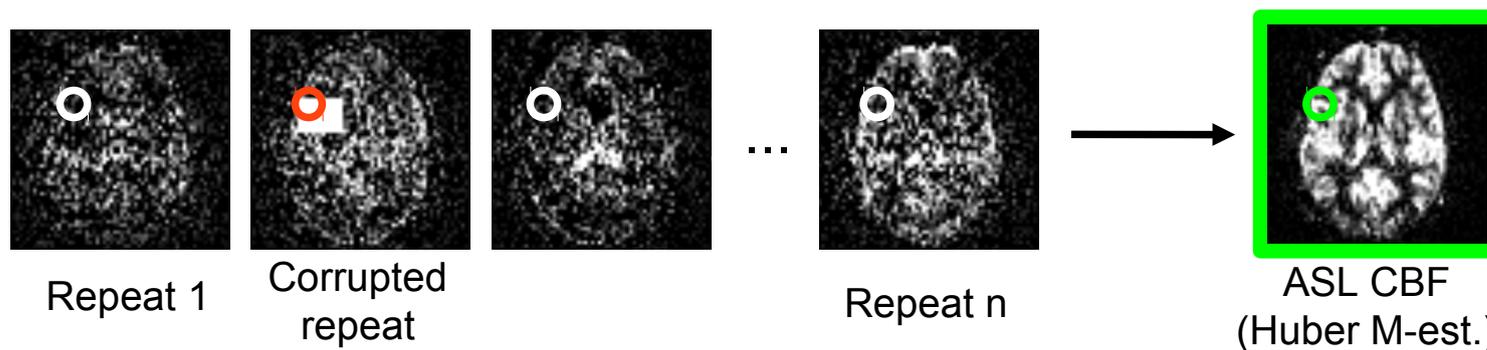
- But the sample mean is very sensitive to outliers.



- In the literature, Tan et al. proposed an outlier removal technique based on z-scores applied to the mean (or standard deviation) of the volume intensity:

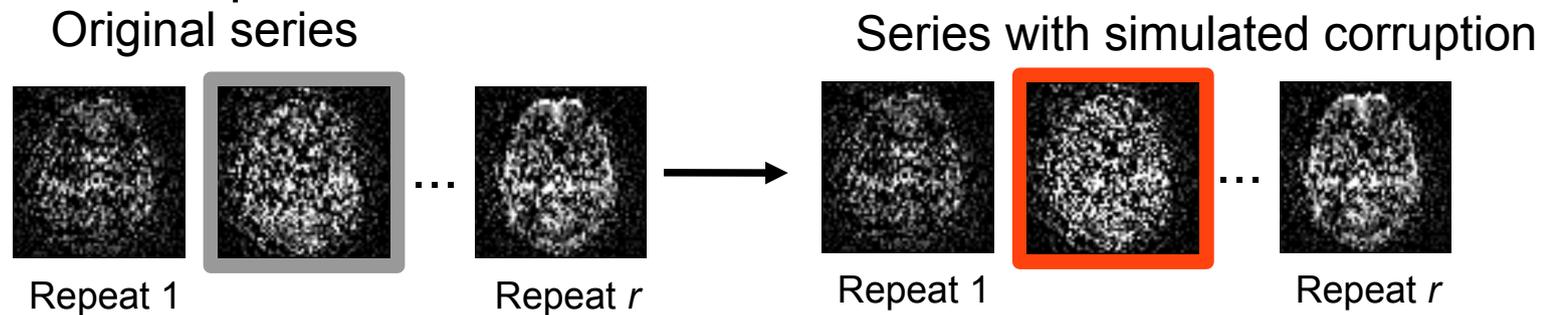


- We propose to rely on robust statistics, namely Huber's M-estimator:

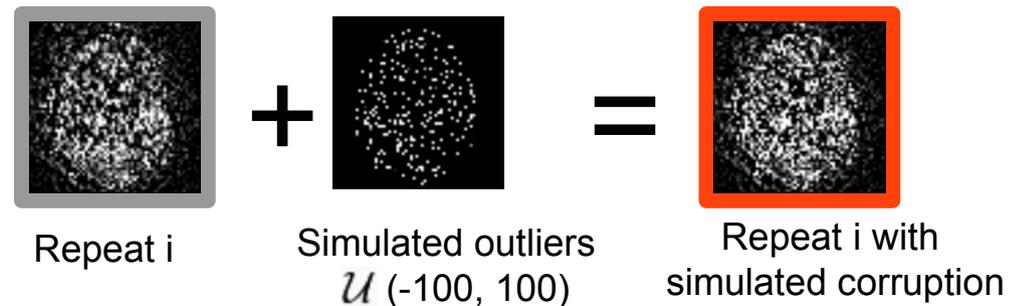




- **Experiment 1:** Illustration of the theoretical behavior of the 3 estimates.
- Simulated corruption:



For each corrupted volume

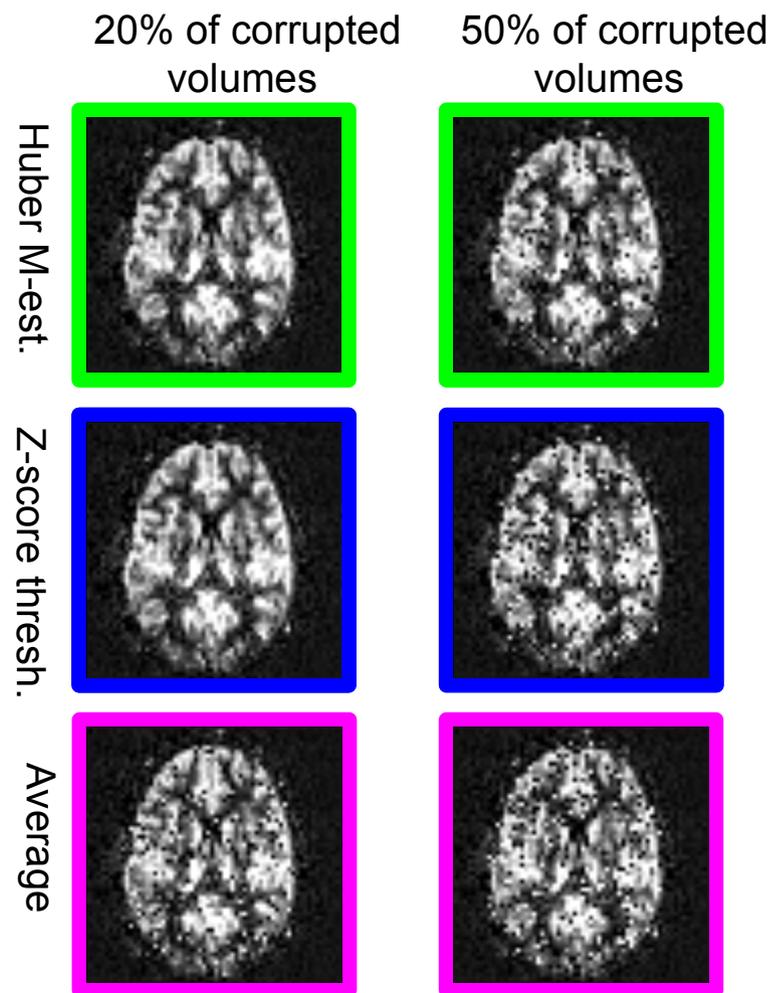
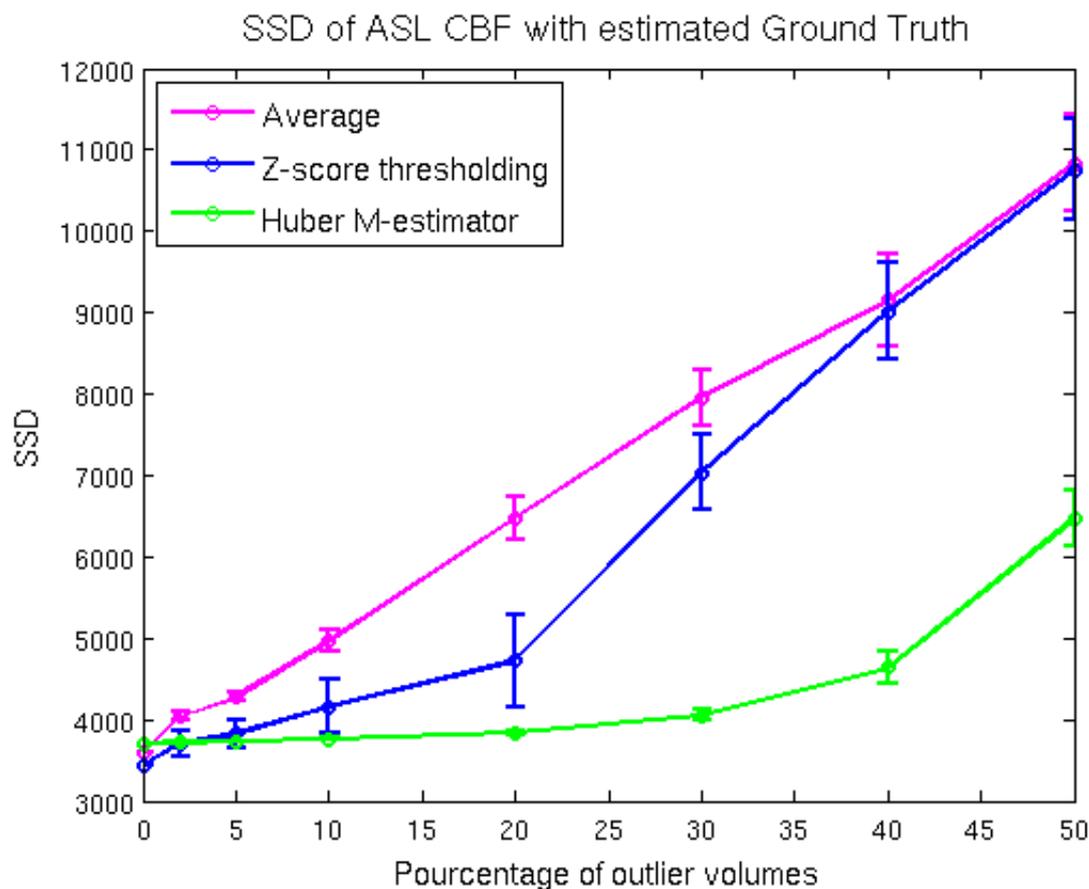


- Comparison of each estimate with the ground truth computed by averaging a very long ASL sequence (~25 min).

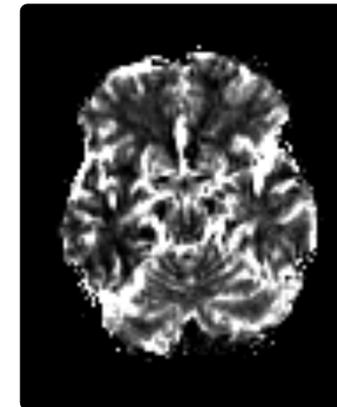
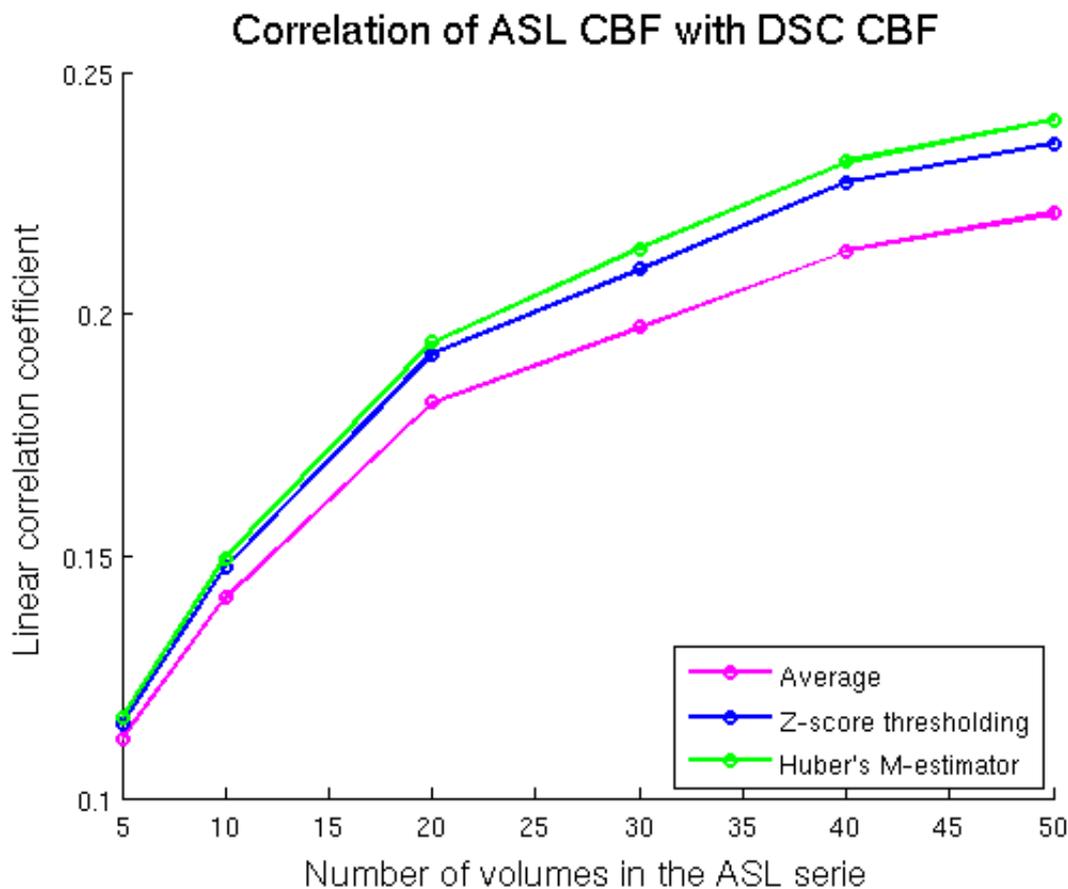


- **Experiment 2:** Performances of the 3 estimates on real clinical datasets.
- Data:
 - 26 patients diagnosed with brain tumors.
 - PICORE Q2TIPS PASL, 60 repetitions
 - Dynamic Susceptibility Contrast imaging (DSC)
- Decimation of the data to get from 5 to 50 repetitions.
- Comparison of each estimate with the ground truth computed by from the DSC sequence with a correlation coefficient.

- **Experiment 1:** Illustration of the theoretical behavior of the 3 estimates.



- **Experiment 2:** Performances of the 3 estimates on real clinical datasets.



DSC CBF
Ground truth



ASL CBF
(Average)



ASL CBF
(z-score)



ASL CBF
(Huber's M-est.)



- We studied the behavior of z-thresholding and Huber's M-estimators to compute CBF estimates in ASL.
- On theoretical ground, Huber's M-estimator is clearly more robust than z-thresholding.
- On the tested clinical cases, the superiority was less pronounced but still present.
- Overall, both robust methods outperform the sample mean on simulated and real data. In patient populations, where artefacts are more frequent, we advise the use of a robust approach to compute CBF maps in ASL.