

- Luca Carlone: Certifiable perception for Robots and autonomous vehicles: from robust algorithms to robust systems.

- Certifiable perception algorithms:

• Image-based object localization

Feature detection  $\rightarrow$  Model fitting / estimation (3D registration)

RGB: Yang CVPR'20

PCL: PointNetLK CVPR'19, SmoothNet CVPR'19

Teaser RSS'19, TRO'20

Issues: 1. front-end (feature detection) has many outliers.

2. back-end may fail if there are many outliers

• Why does the back-end fail?

$$\min_x \sum_{i \in \mathcal{M}} \|r(x, y_i)\|^2$$

residual
estimate
feature from front-end

a. L2-norm is not robust to outliers

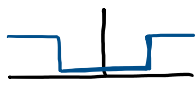
b. M-estimator robust loss function



(local solvers; needs initial guess)

fails without notice

c. Consensus maximization



RANSAC (fails with many outliers, non-deterministic)

fails without notice

• Certifiable algorithms: fast algorithms that solve outlier rejection to optimality in virtually all problem instances or detect failure in worst-case problems.

Robust estimation  $\rightarrow$  optimization over the ring of polynomials

$\rightarrow$  Semidefinite relaxation (Lasserre hierarchy)

This enables: Robust solvers (no initial guess, deterministic, tolerate extreme outliers, global optimality, detect failures)

TEASER++: Certifiable object localization in point clouds.

runs in 20 ms

Shape#: Certifiable object localization in images

- Towards system-level guarantees & real-time high-level understanding:

• kimera: real-time 3D metric-semantic understanding

• 3D Dynamic Scene Graph.

"One Ring to Rule Them All"