

# Registration and 3D Reconstruction of Creased Surfaces by Shape-from-Template

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# Introduction

## Context

3D reconstruction of deformable objects from 2D images or videos

Three main approaches

### Non-Rigid Structure-from-Motion (NRSfM)



Sequence of images

### Shape-from-Template (SfT)



Template



Image



- One image
- No scale ambiguity



- Needs textured surfaces
- Assumes smooth deformations

### Shape-from-Shading (SfS)



Light



Reflectance



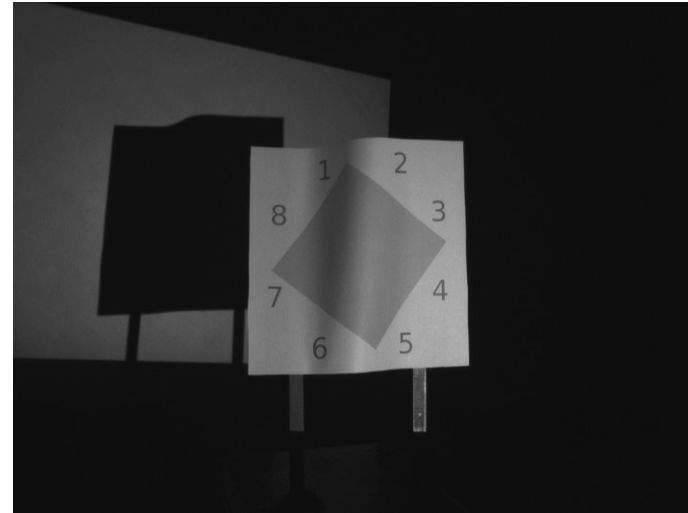
Camera  
Response



Image

# State-of-the-Art

What is the problem with **complex deformations** and **poorly-textured surfaces** ?



Reduction of dimensionality or usual regularizers favour smooth deformations



Poorly-textured regions are interpolated by the textured regions



# State-of-the-Art

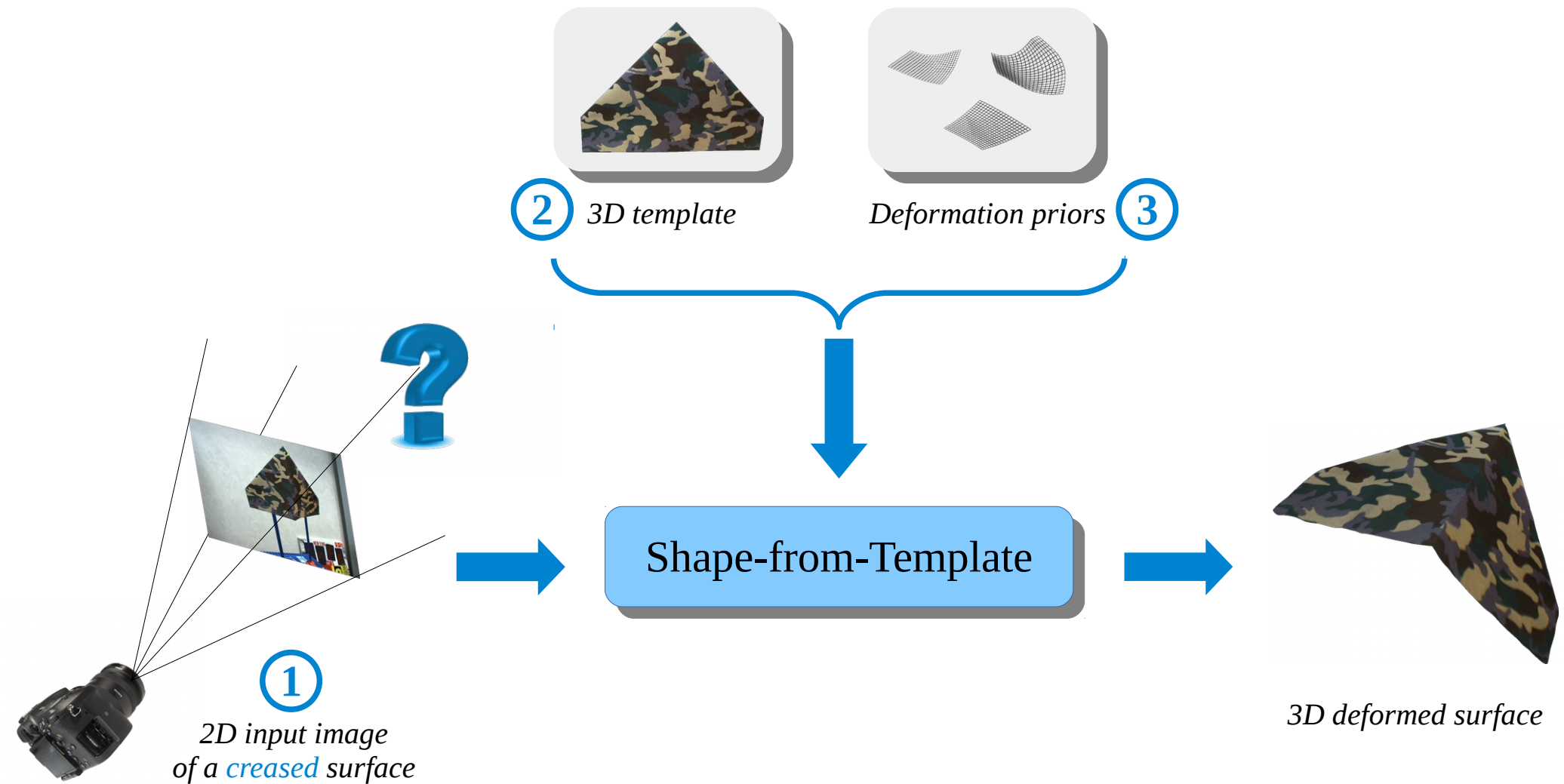
What is the problem with **complex deformations** and **poorly-textured surfaces** ?



➡ Focus on **complex deformations** such as creases

➡ Closest work [1] :  
Reconstructed creases are a by-product ❌

# Problem Definition



# Assumptions

- Correspondences known
- Calibrated perspective camera
- No self-occlusions
- Isometric and **non-smooth** deformations
- 3D positions of creases **unknown**

# Contributions

Optimising the template's shape  
using motion, boundaries and  
an **adaptive smoothing term**



**Without knowing a priori**  
the location of creases



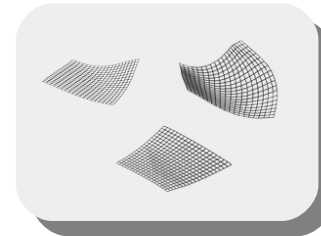
Reconstruct **complex deformations** such as creases

# Solution Proposed

Shape and  
Deformation Model



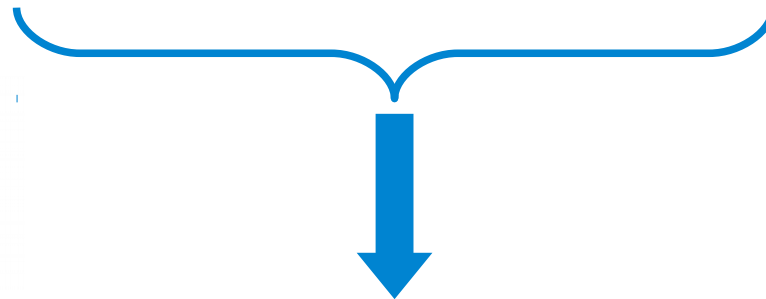
*3D template*



*Deformation priors*



A Spatially-Varying  
Smoothing



Shape-from-Template

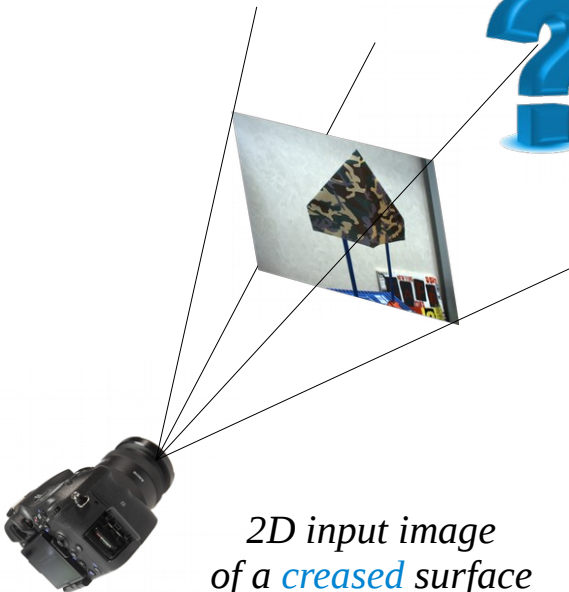


*3D deformed surface*



Optimization  
Framework

2D input image  
of a *creased* surface





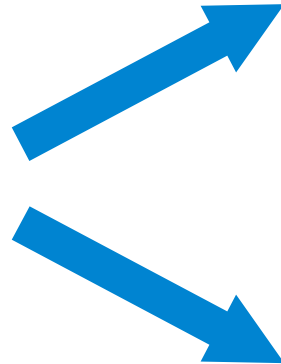
# Solution Proposed

Shape and  
Deformation Model

Optimization  
Framework

A Spatially-Varying  
Smoothing

Dense regular  
triangular mesh



Position of each vertex  
in camera coordinates with  
an **unknown** 3D-vector

Allows complex  
deformation modelling

# Solution Proposed

Shape and  
Deformation Model

Optimization  
Framework

A Spatially-Varying  
Smoothing

- **Unknowns** : position of each vertex in the camera coordinates frame
- **Initialization** using an existing SfT method [4]
- Non-convex **refinement**
  - Gradient-based optimization
  - Minimization of cost function

image constraints + deformation priors

- 
- Motion of keypoints
  - Reprojection of surface boundaries

- 
- Isometry
  - Smoothing

# Solution Proposed

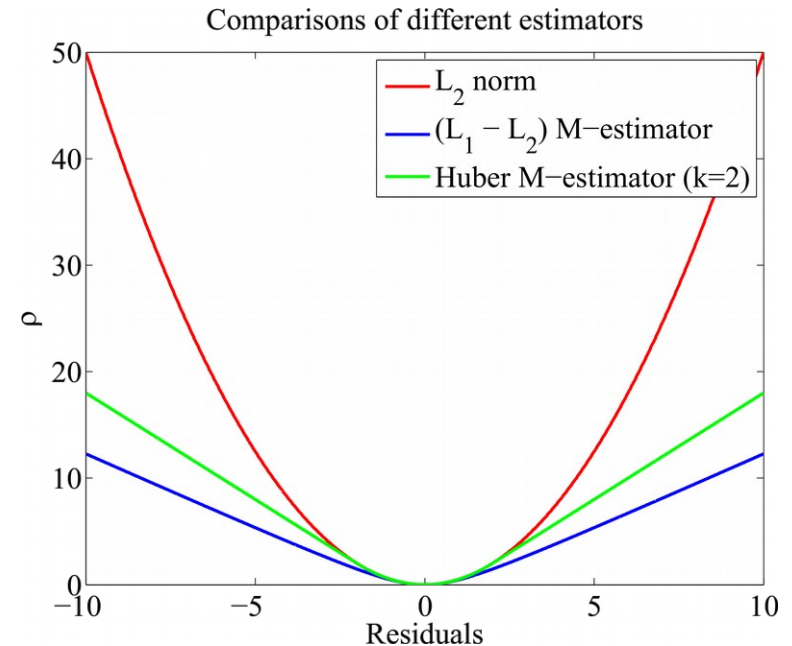
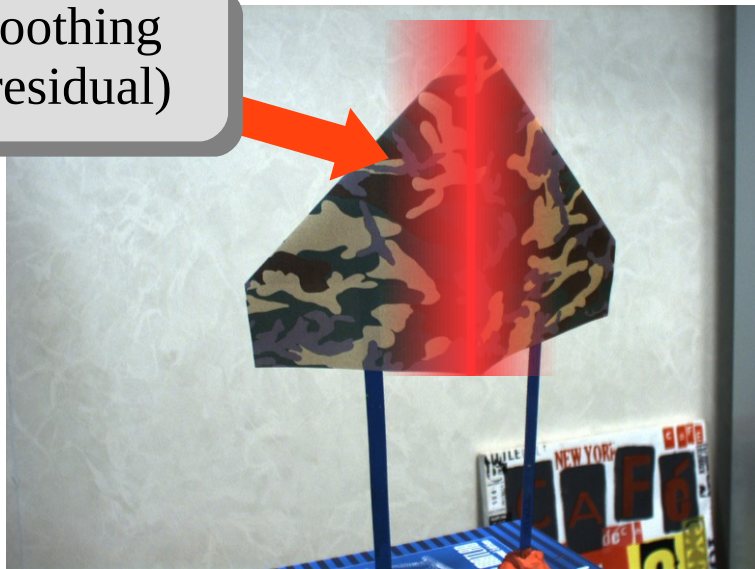
Shape and  
Deformation Model

Optimization  
Framework

A Spatially-Varying  
Smoothing

- M-estimators : more robust
- Principle : fit to outliers
- Implementation

High smoothing  
error (=residual)



# Solution Proposed

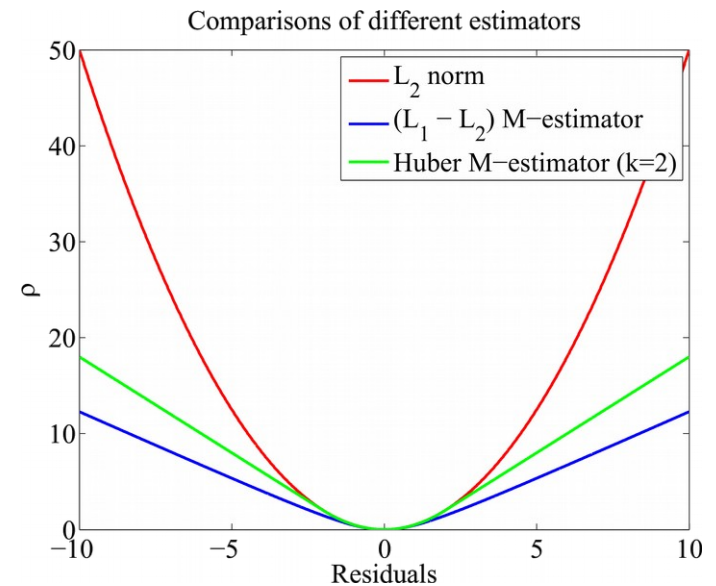
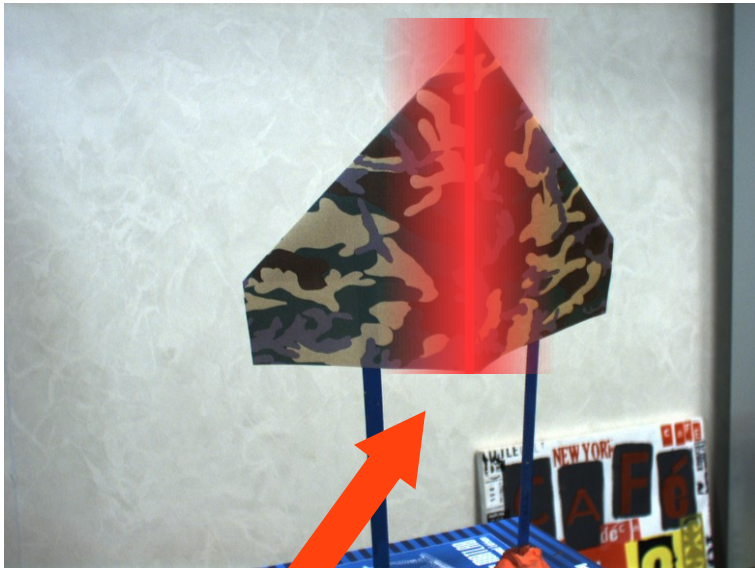
## Shape and Deformation Model

## Optimization Framework

## A Spatially-Varying Smoothing

- M-estimators : more robust
- Principle : fit to outliers
- Implementation

idual)



# Experiments

## Datasets



*Sheet of paper*



*Paper plane*



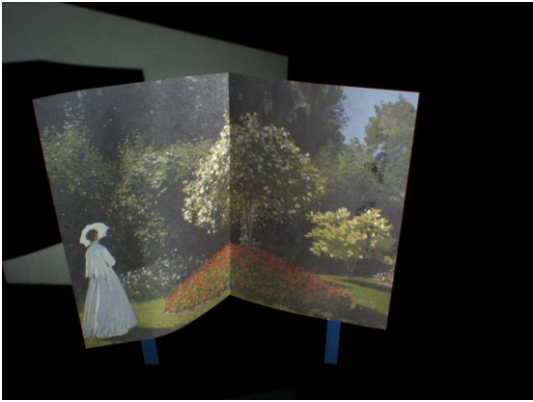
*Cardboard box*

- $\approx 300$  correspondences computed from [5]
- Possible mismatches
- 1000 boundary points

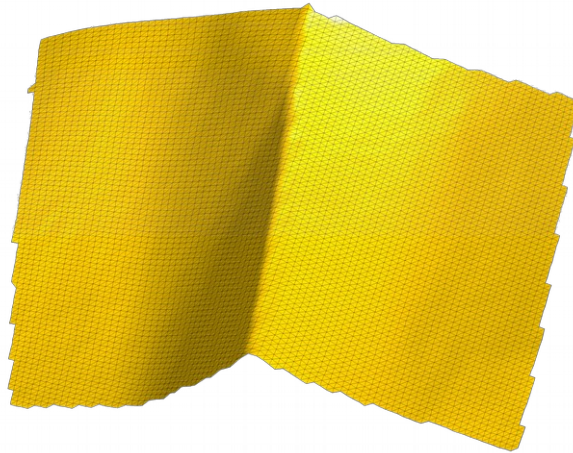


# Experiments

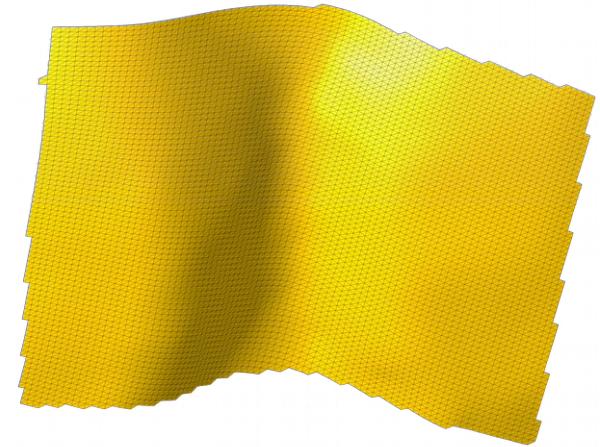
*Sheet of paper* : 3D reconstructions



*Input image*



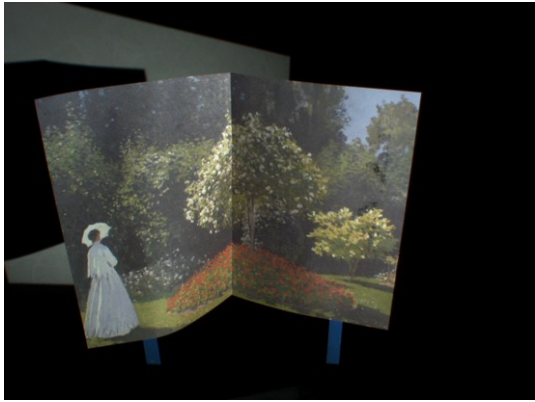
*Ground truth*



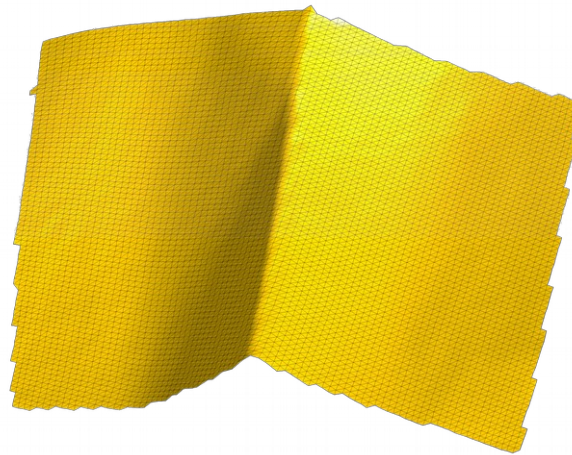
*Best state-of-the-art : **ReD12***

# Experiments

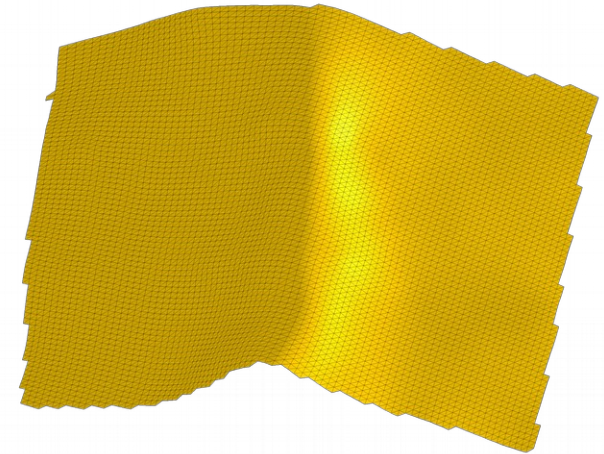
*Sheet of paper* : 3D reconstructions



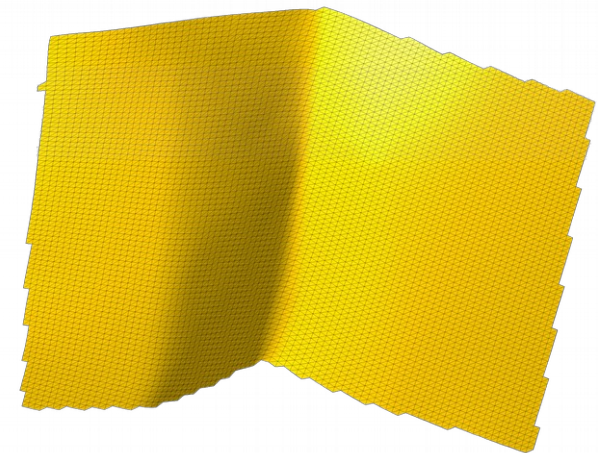
*Input image*



*Ground truth*



**Ours\_l2**



**Ours**

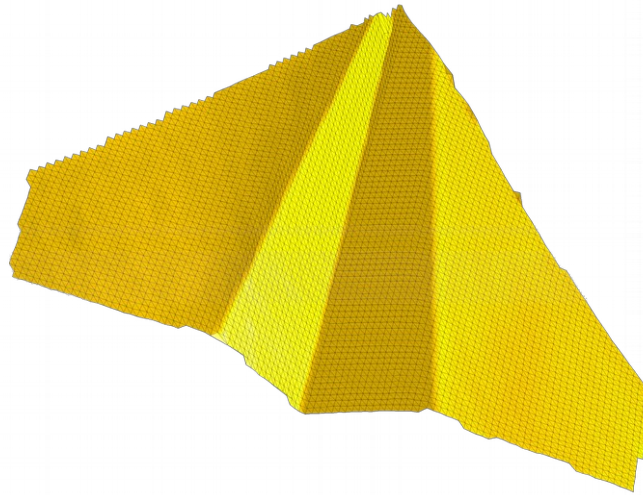


# Experiments

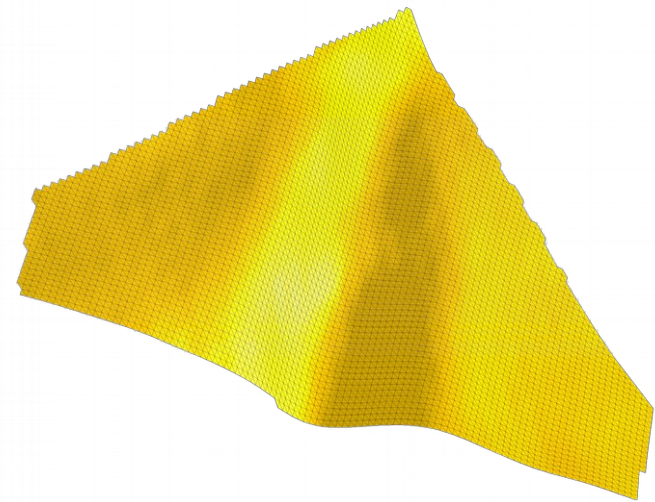
*Paper plane* : 3D reconstructions



*Input image*



*Ground truth*



*Best state-of-the-art : **ReD12***

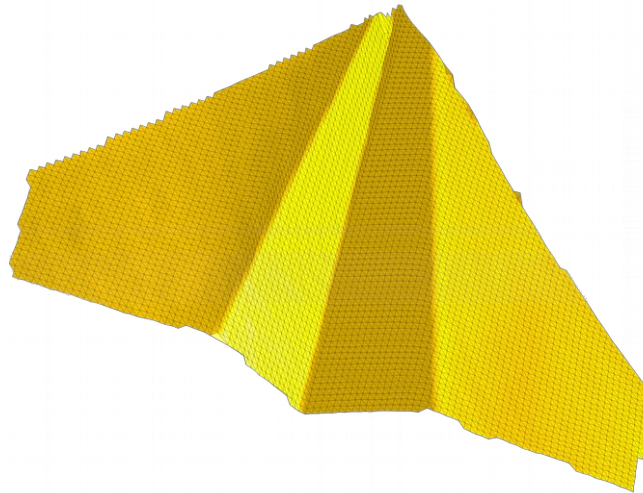


# Experiments

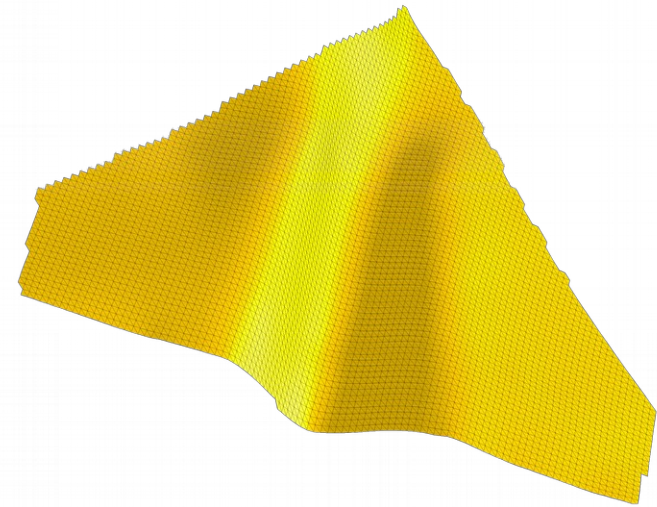
*Paper plane* : 3D reconstructions



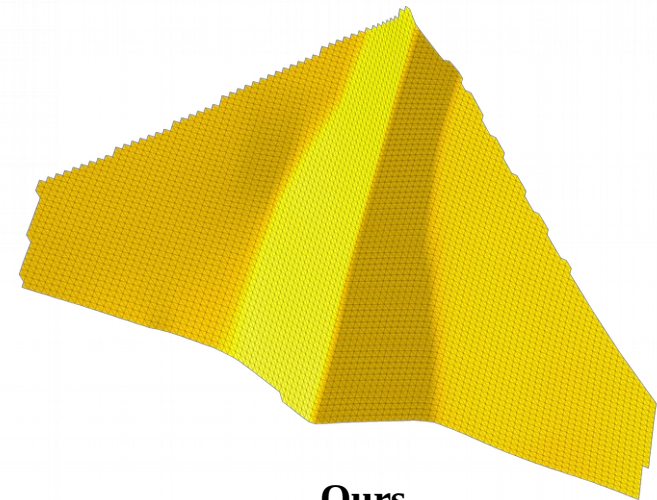
*Input image*



*Ground truth*



**Ours\_l2**



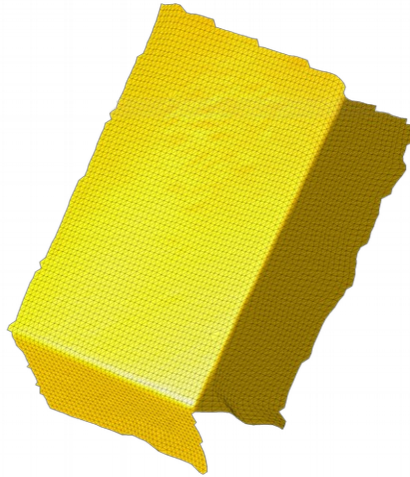
**Ours**

# Experiments

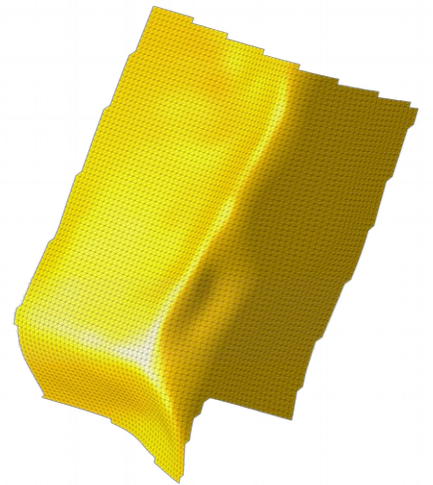
## *Cardboard box : 3D reconstructions*



*Input image*



*Ground truth*



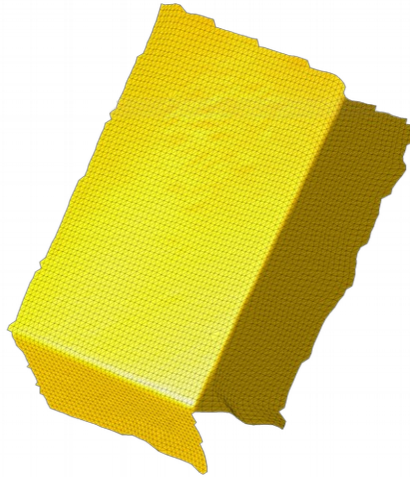
*Best state-of-the-art : **ReJ14***

# Experiments

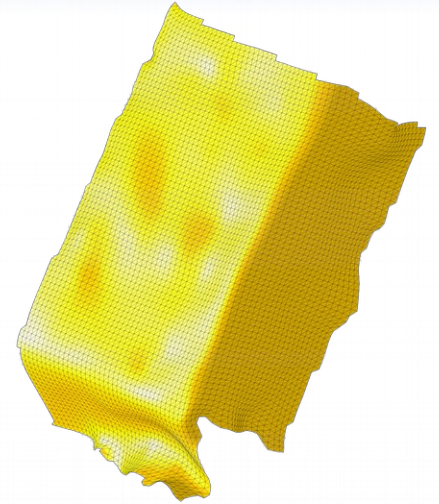
## *Cardboard box : 3D reconstructions*



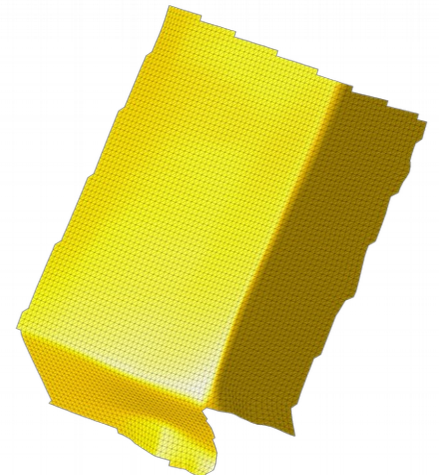
*Input image*



*Ground truth*



**Ours\_l2**



**Ours**



# Conclusion

- Solution to reconstruct **complex deformations** from a 2D image, a 2D template, motion and boundary constraints
- An adaptive smoothness term thanks to **M-estimator**
- No information of 2D/3D location of creases required
- Perspectives : handle false edges, poorly-textured surfaces with shading, self-occlusions,...

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