
Capturing and Editing Reality – Performance Capture of the Real World in Motion

Christian Theobalt

Graphics, Vision, and Video

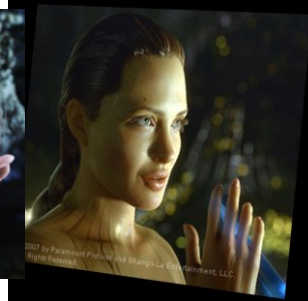
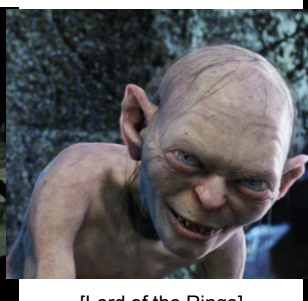


Christian Theobalt

The Modeling Bottleneck

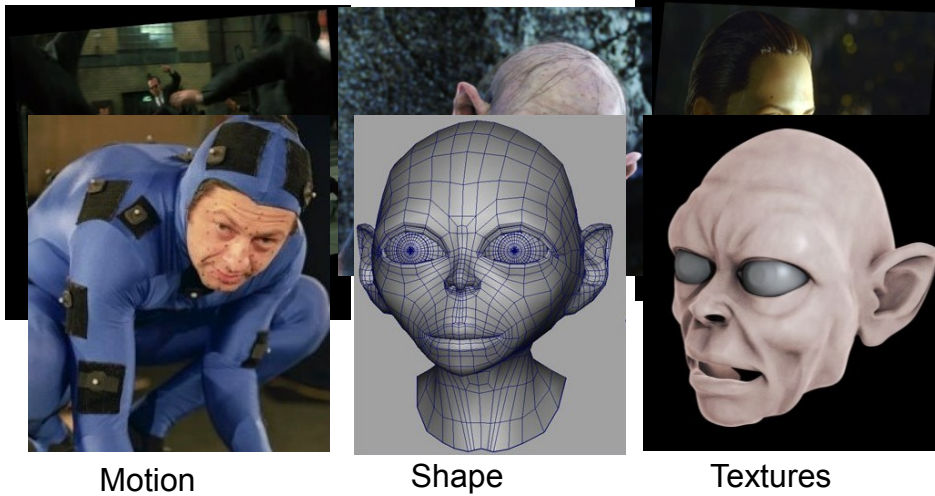


[Lord of the Rings]



[Beowulf]

The Modeling Bottleneck



1

Christian Theobalt

Performance Capture



[de Aguiar et al., SIGGRAPH 2008]

- High-quality shape, motion and texture of people in general clothing from multi-view video
- Handful of cameras to single camera, no markers
- Exceed capabilities of existing Mocap technology by far

Christian Theobalt

Skeleton + Surface



Template-based pose and shape optimization + multi-view segmentation

[Liu et al. CVPR 2011 oral, IEEE Trans. PAMI 2013]

Christian Theobalt

Important Limitations



- Limited accuracy
- Limited scene complexity
- Starkly restricted capture environment

Christian Theobalt

What We Want: Capture Reality



- Complex appearance
- Uncontrolled recording and lighting settings
- Tremendous scene complexity
- Simple and sparse camera setups
- Ability to edit captured footage

Christian Theobalt

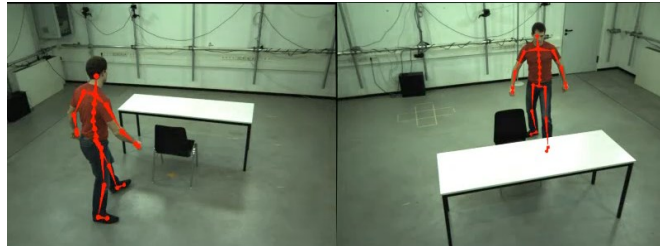
Improving Reconstruction Quality and Ability

Christian Theobalt

Capturing in Less Constrained Environments



Occlusions,
fast motions,
dynamic background...

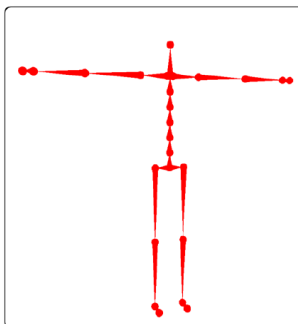


[Stoll et al. ICCV 2011]

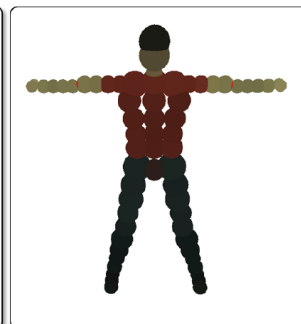
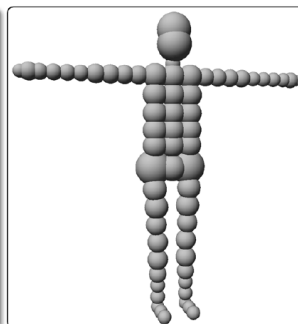
Christian Theobalt

3D Sum of Gaussians Body Model

- Skeleton + Gaussians with color model



58 DoFs



63 Gaussians

Christian Theobalt

2D Sum of Gaussians Body Model

- Each video frame converted to 2D SoG



Video frame

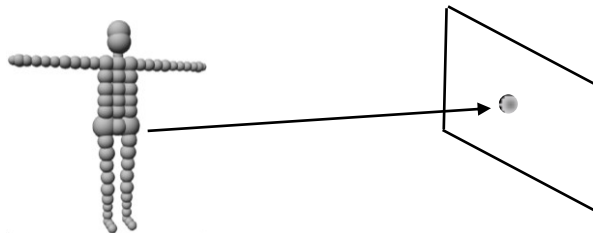


Quad tree –
each region one 2D Gaussian

Christian Theobalt

3D-2D Similarity Function

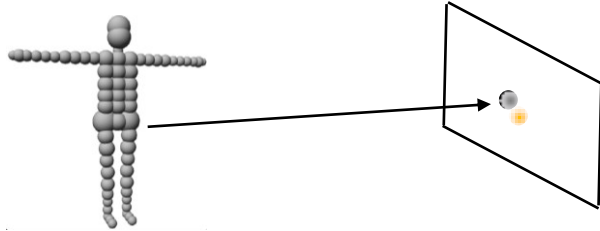
- Projection of 3D Gaussians into cameras



Christian Theobalt

3D-2D Similarity Function

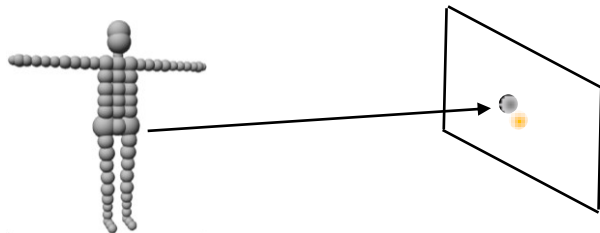
- Projection of 3D Gaussians into cameras



Christian Theobalt

3D-2D Similarity Function

- Projection of 3D Gaussians into cameras



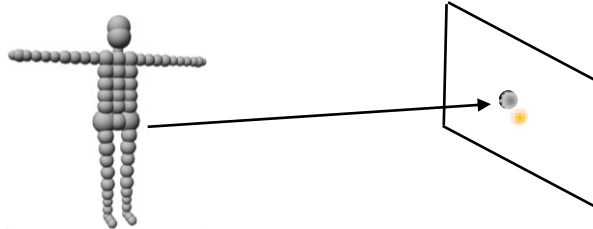
- 2D-2D SoG similarity in one camera view

$$E_{ij} = \underbrace{d(\mathbf{c}_i, \mathbf{c}_j)}_{\text{Color similarity}} \int_{\Omega} \underbrace{\mathcal{B}_i(x)}_{\text{Projected model Gaussian}} \underbrace{\mathcal{B}_j(x)}_{\text{Image Gaussian}} dx$$

Christian Theobalt

3D-2D Similarity Function

- Projection of 3D Gaussians into cameras



- 2D-2D SoG similarity – closed form solution

$$\begin{aligned}
 E_{ij} &= d(\mathbf{c}_i, \mathbf{c}_j) \int_{\Omega} \mathcal{B}_i(x) \mathcal{B}_j(x) dx \\
 &= d(\mathbf{c}_i, \mathbf{c}_j) 2\pi \frac{\sigma_i^2 \sigma_j^2}{\sigma_i^2 + \sigma_j^2} \exp\left(-\frac{\|\mu_i - \mu_j\|^2}{\sigma_i^2 + \sigma_j^2}\right)
 \end{aligned}$$

Christian Theobalt

Pose Similarity Measure

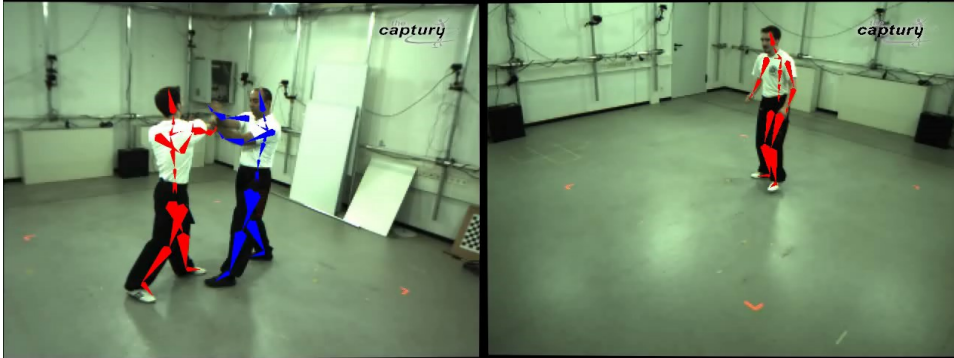
- Find pose parameters Θ that maximize

$$\mathcal{E}(\Theta) = \underbrace{E(\Theta)}_{\substack{\text{SoG similarity} \\ \text{over all Gaussians and} \\ \text{cameras}}} - w_l \underbrace{E_{lim}(\mathcal{M}\Theta)}_{\text{Joint limits}} - w_a \underbrace{E_{acc}(\Theta)}_{\text{acceleration penalty}}$$

- Energy function smooth
- Analytic derivatives convenient to compute
- Occlusion conveniently handled
- Efficient gradient-based optimization

Christian Theobalt

More Results



Min nr. of cameras: 5
Pose estimation > 30 fps

Christian Theobalt

Space-time Reconstruction



8 GoPros, 30 fps, not frame synchronized
[Elhayek et al., CVPR 2012]

Christian Theobalt



Christian Theobalt

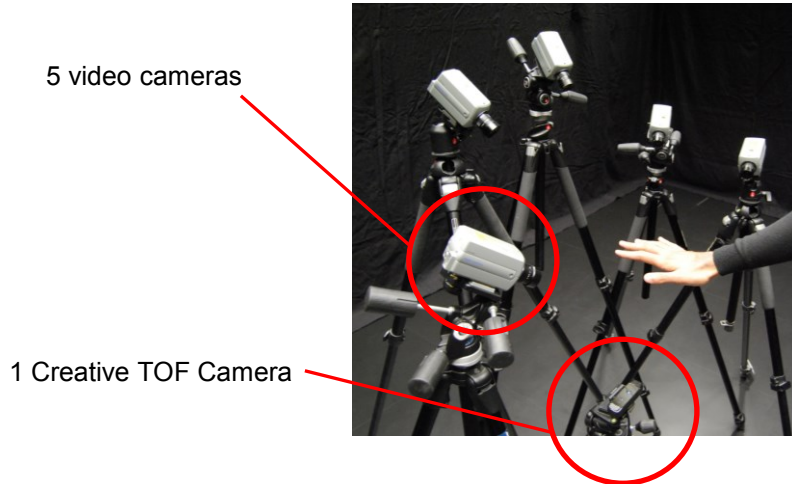
Extension to Hands



S. Sridhar, A. Oulasvirta, and C. Theobalt, *Interactive Markerless Articulated Hand Motion Tracking using RGB and Depth Data*, ICCV 2013

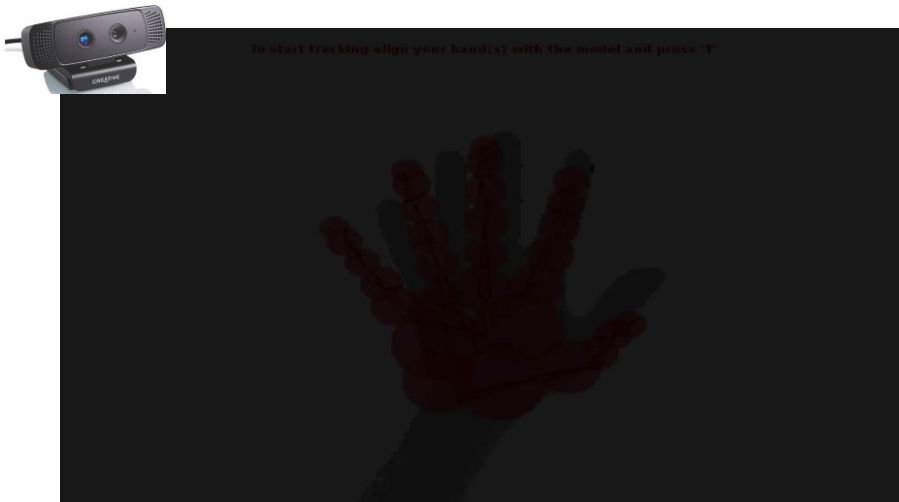
Christian Theobalt

Real-time Hand-Tracking: Setup



Christian Theobalt

Real time Hand Tracking with Single Depth Camera



Christian Theobalt

How can we reconstruct more detail in uncontrolled environments ?

Christian Theobalt

Current Methods



- Limit to amount of captured detail



Christian Theobalt

Exploit Shading / Lighting Cues

- Shading / lighting effects around high frequency features



[<http://www.verycoolphotoblog.com/2012/11/05/old-man-3>]

Christian Theobalt

Related Work

Photometric Stereo



[Woodham '80, Hernandez et al. 2007...]

Dynamic Photometric Stereo



Shape-from-Shading



[Zhang '99, Prados et al. 2005...]

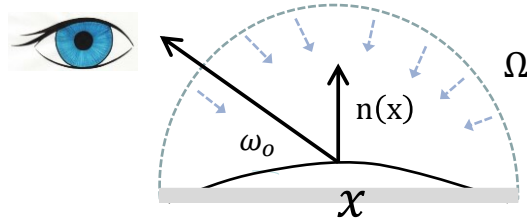


[Vlasic et al., SIGASIA '09]

Christian Theobalt

Shape Refinement – Inverse Rendering

- Reflectance Equation (Kajiya'86)



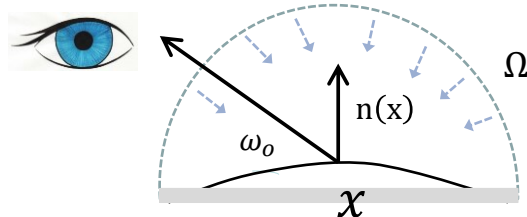
$$B(x, \omega_o) = \int_{\Omega} \rho(\omega_i, \omega_o) L(\omega_i) V(x, \omega_i) \max(\omega_i \cdot n(x), 0) d\omega_i$$

← Rendering

Christian Theobalt

Shape Refinement – Inverse Rendering

- Reflectance Equation (Kajiya'86)



$$B(x, \omega_o) = \int_{\Omega} \rho(\omega_i, \omega_o) L(\omega_i) V(x, \omega_i) \max(\omega_i \cdot n(x), 0) d\omega_i$$

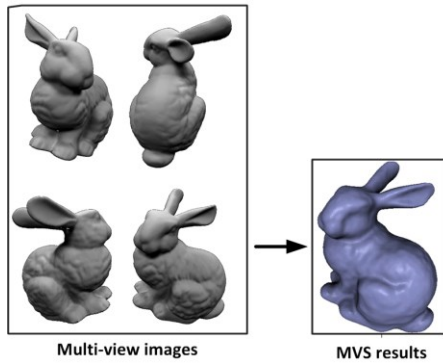
← Rendering

→ Inverse rendering: find illumination, reflectance, shape

[Wu et al. CVPR2011, ICCV 2011, ECCV2012]

Christian Theobalt

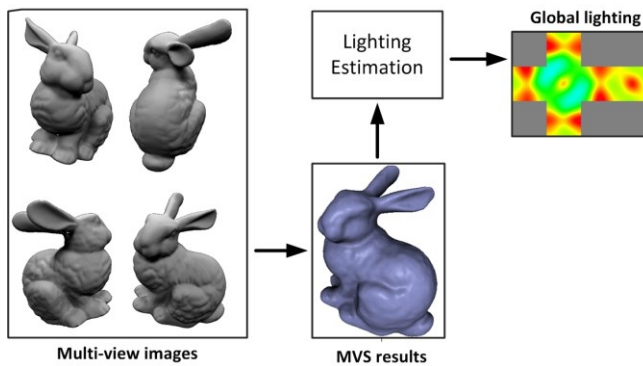
Shading-based Static Scene Refinement



[Wu et al. CVPR 2011]

Christian Theobalt

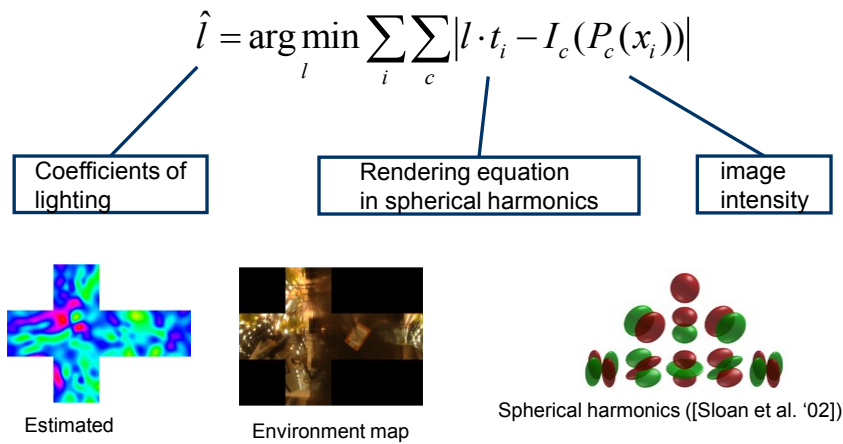
Shading-based Static Scene Refinement



[Wu et al. CVPR 2011]

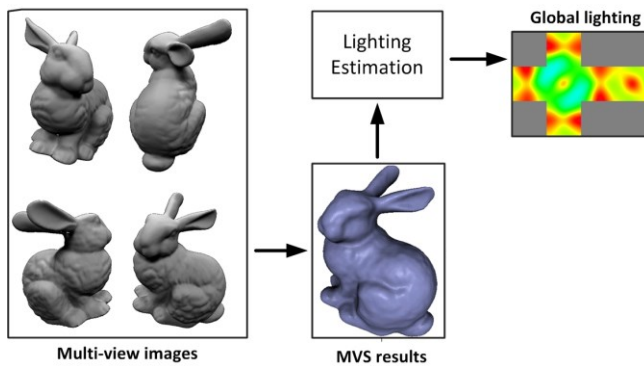
Christian Theobalt

Step I: Lighting Estimation



Christian Theobalt

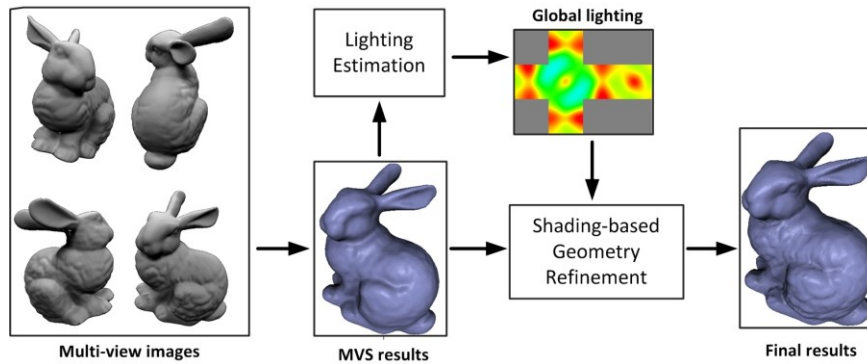
Shading-based Static Scene Refinement



[Wu et al. CVPR 2011]

Christian Theobalt

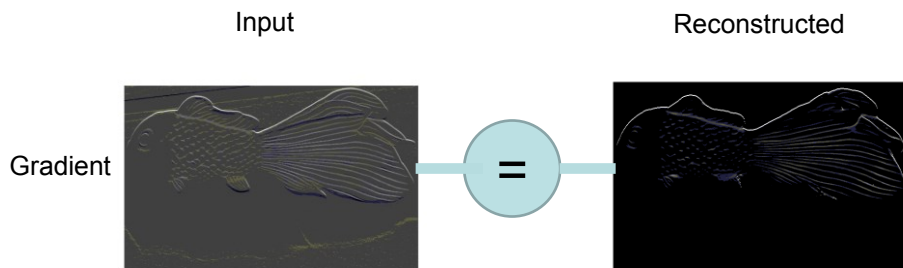
Shading-based Static Scene Refinement



[Wu et al. CVPR 2011]

Christian Theobalt

Shading-based Geometry Refinement

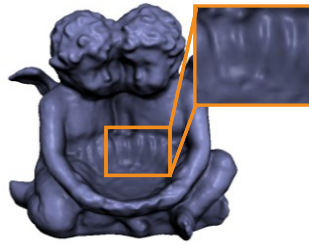


Christian Theobalt

Combine Stereo + Shading



(a) Captured image



(b) MVS result



(c) Our result

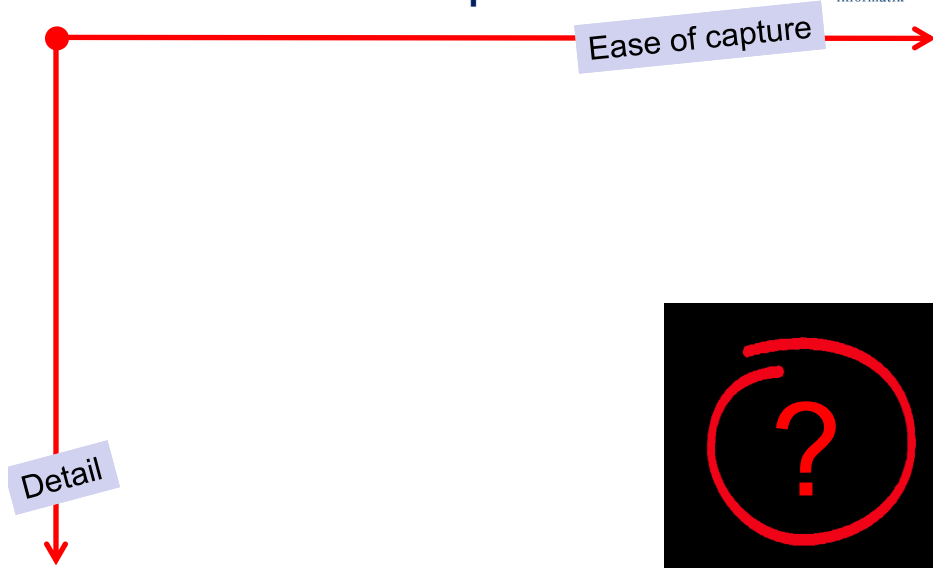


(d) Laser scan

[Wu et al. CVPR 2011]

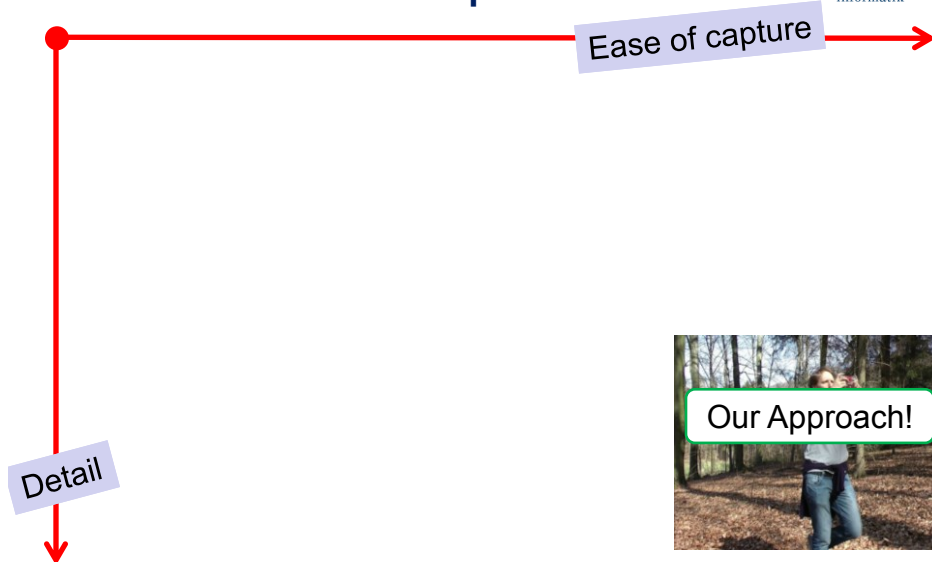
Christian Theobalt

Facial Performance Capture



Christian Theobalt

Facial Performance Capture



Christian Theobalt

High-quality Binocular Face Capture



L.Valgaerts, C. Wu, A. Bruhn, H.-P. Seidel, C. Theobalt, Binocular Facial Performance Capture under Uncontrolled Illumination, SIGGRAPH Asia 2012

Christian Theobalt

Method Overview

Left view



Right view

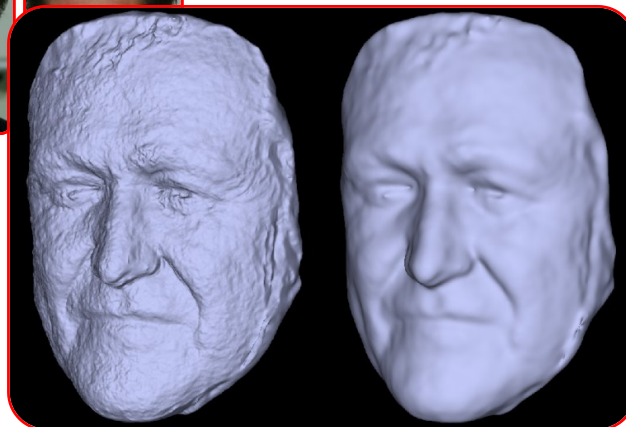


Christian Theobalt

Method Overview

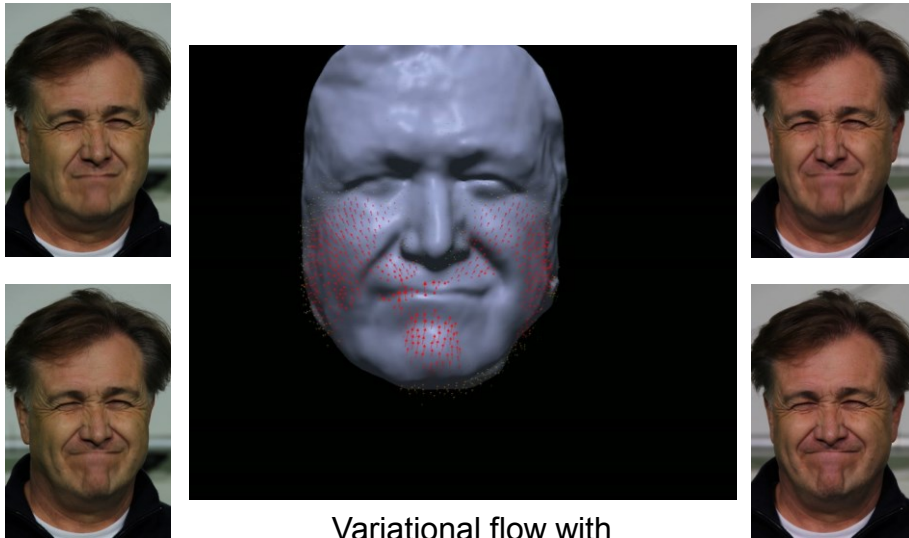


Template
reconstruction



Christian Theobalt

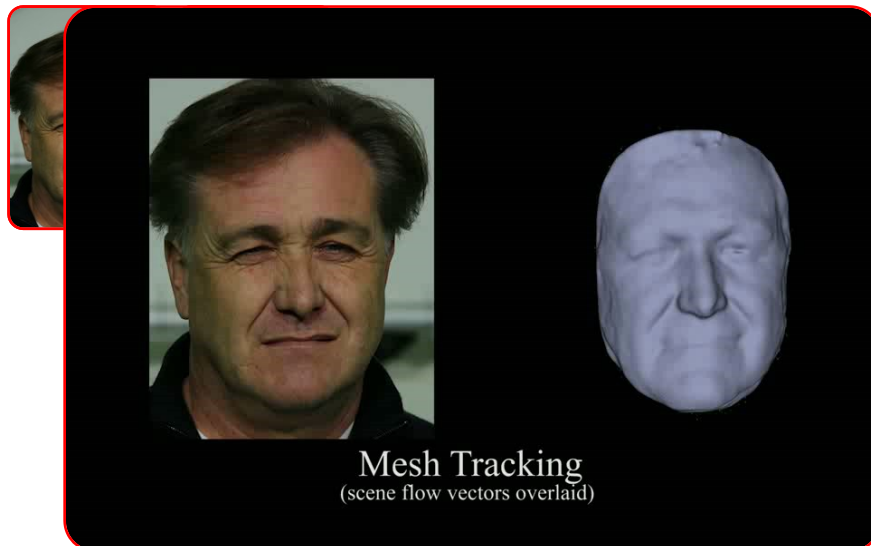
Scene Flow Result



Variational flow with
structure-aware regularization

Christian Theobalt

Method Overview



Christian Theobalt

Method Overview



Christian Theobalt

Dynamic Shape Refinement

Previous
frame



Fine Scale Shape?

Current
frame

Lighting?



Christian Theobalt

Dynamic Shape Refinement

Previous
frame



Fine Scale Shape?

Current
frame

Lighting?

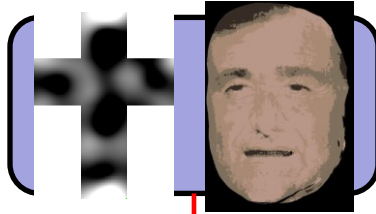


⇒ Compute **lighting + shape** jointly (extends [Wu et al. 2011])

Christian Theobalt

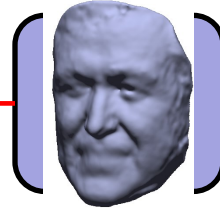
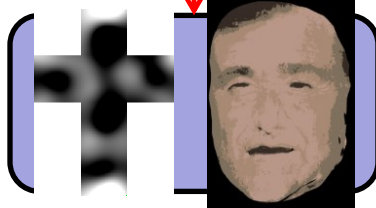
Dynamic Shape Refinement

Previous
frame



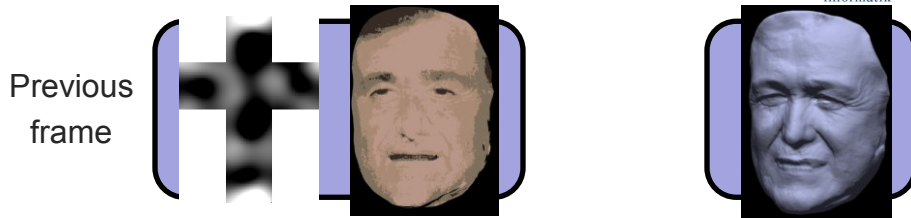
Lighting estimation

Current
frame

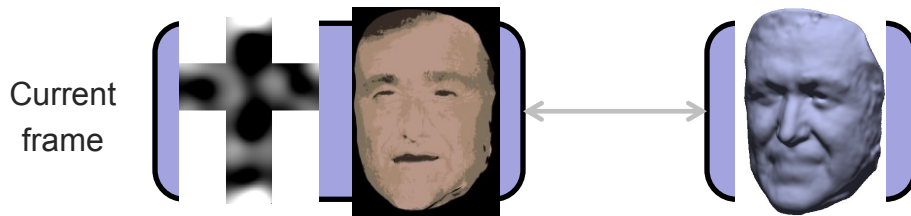


Christian Theobalt

Novel Shading Energy



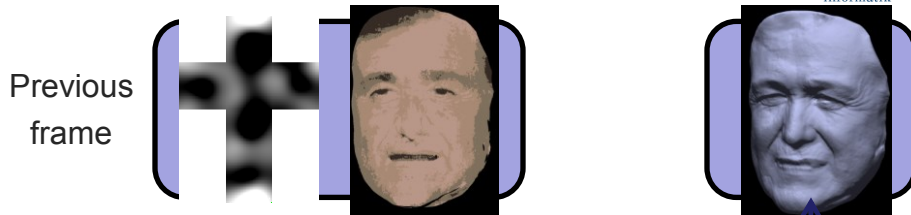
Shading constraints



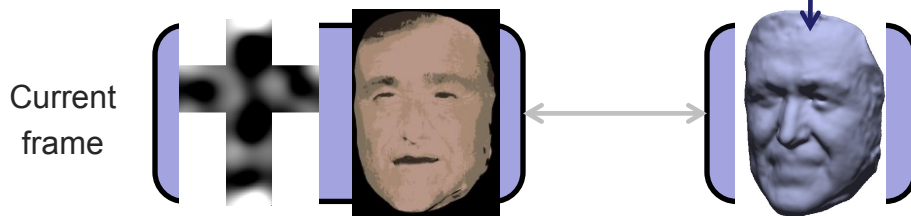
$$E_{tot} = E_{sha}$$

Christian Theobalt

Novel Shading Energy



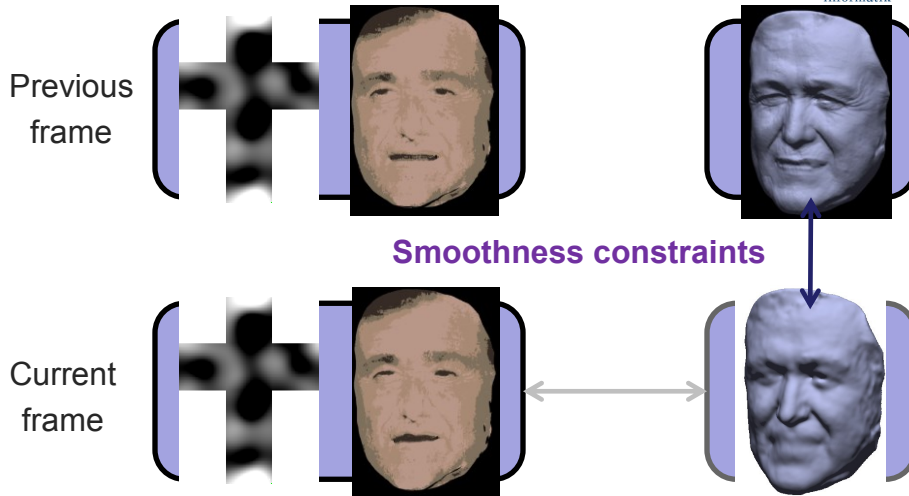
Similarity constraints



$$E_{tot} = E_{sha} + \alpha E_{sim}$$

Christian Theobalt

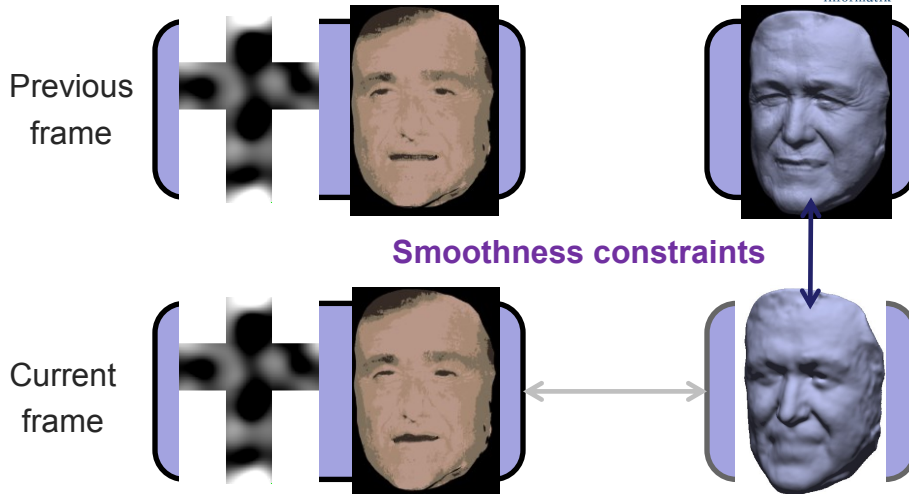
Novel Shading Energy



$$E_{tot} = E_{sha} + \alpha E_{sim} + \beta E_s$$

Christian Theobalt

Novel Shading Energy



$$E_{tot} = E_{sha} + \alpha E_{sim} + \beta E_s$$

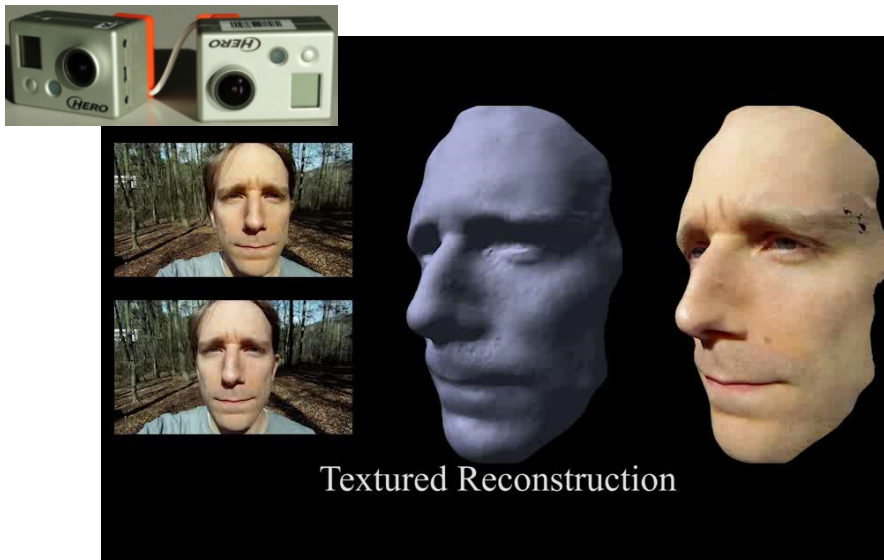
Christian Theobalt

Refinement Result



Christian Theobalt

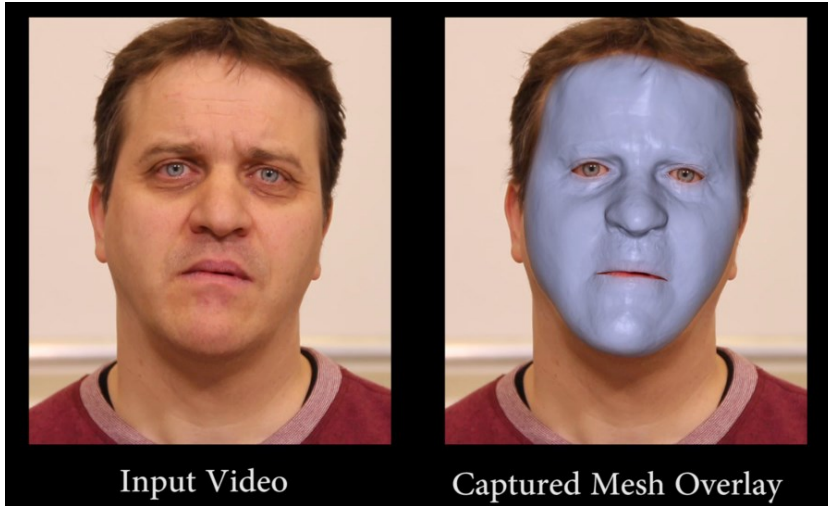
Result - outdoors, changing lighting



Stereo pair of GoPro bike helmet cams, handheld

Christian Theobalt

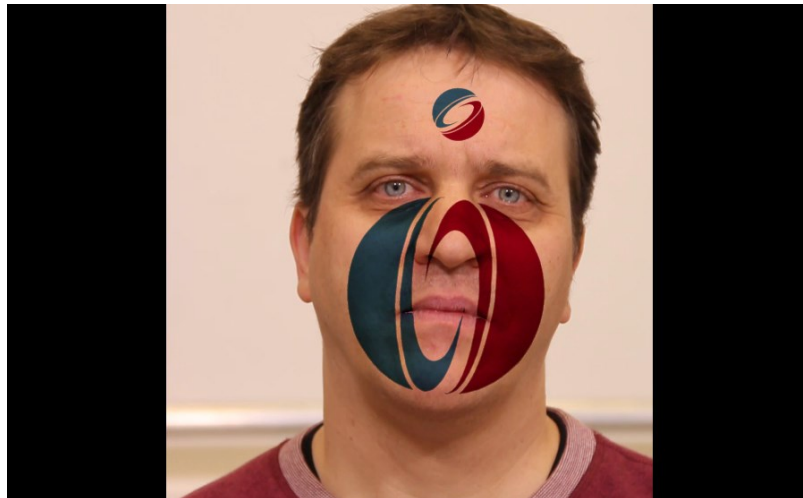
Monocular Face Reconstruction



P. Garrido, L. Valgaerts, C. Wu, C. Theobalt, Reconstructing Detailed Dynamic Face Geometry from Monocular Video, [SIGGRAPH Asia 2013](#)

Christian Theobalt

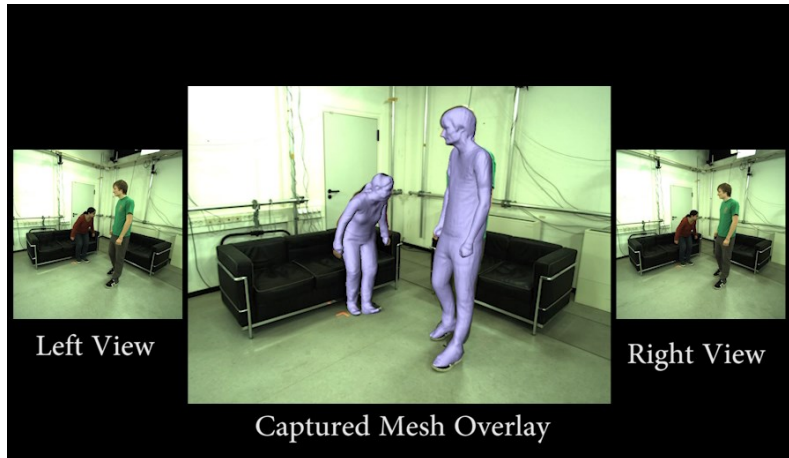
Monocular Face Reconstruction



P. Garrido, L. Valgaerts, C. Wu, C. Theobalt, Reconstructing Detailed Dynamic Face Geometry from Monocular Video, [SIGGRAPH Asia 2013](#)

Christian Theobalt

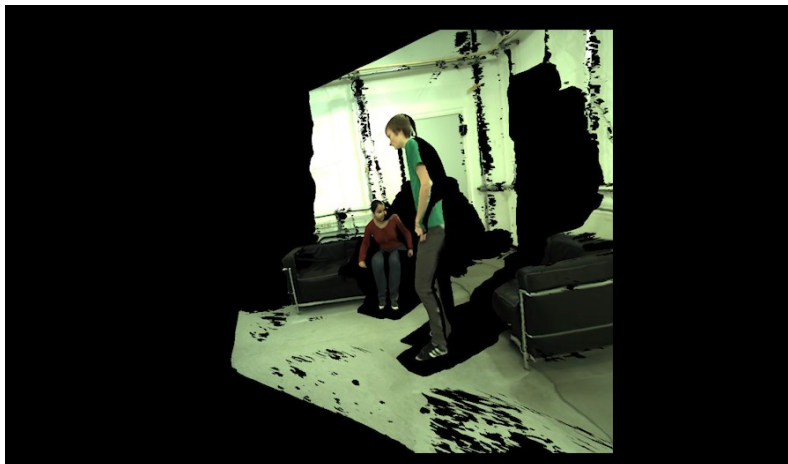
On-Set Performance Capture with a Stereo Camera



C. Wu, C. Stoll, L. Valgaerts, C. Theobalt, On-set Performance Capture of Multiple Actors with a Stereo Camera, [SIGGRAPH Asia 2013](#)

Christian Theobalt

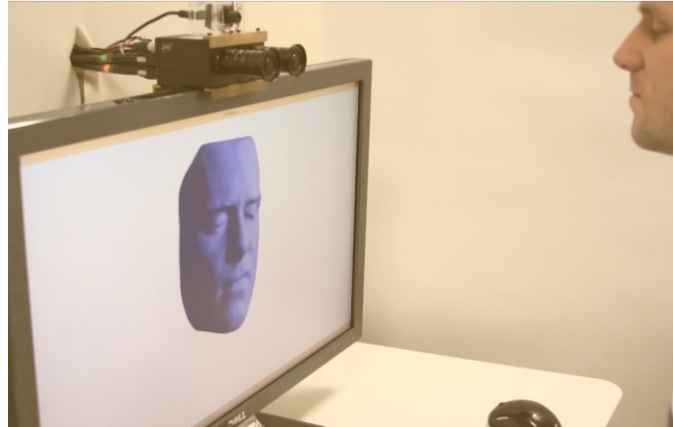
On-Set Performance Capture with a Stereo Camera



C. Wu, C. Stoll, L. Valgaerts, C. Theobalt, On-set Performance Capture of Multiple Actors with a Stereo Camera, [SIGGRAPH Asia 2013](#)

Christian Theobalt

Surface Deformation



M. Zollhoefer, M Niessner, S. Izadi, C. Rehmann, C. Zach, M. Fisher, C. Wu, A. Fitzgibbon, C. Loop, C. Theobalt, M. Stamminger, Real-time Non-rigid Reconstruction Using an RGB-D Camera, [ACM TOG \(SIGGRAPH 2014\)](#)

Christian Theobalt

Modifying Captured Content

Christian Theobalt

Sparse Localized Deformation Components

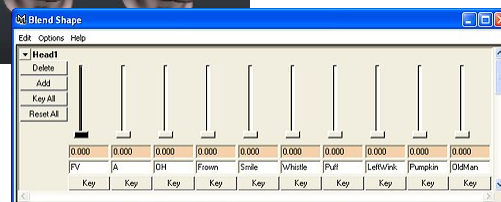
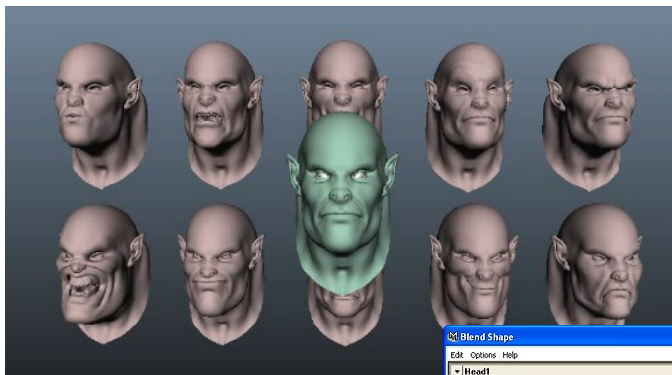


T. Neumann, K. Varanasi, S. Wenger, M. Wacker, M. Magnor, C. Theobalt,
Sparse localized deformation components, ACM TOG (SIGGRAPH ASIA) 2013

Christian Theobalt

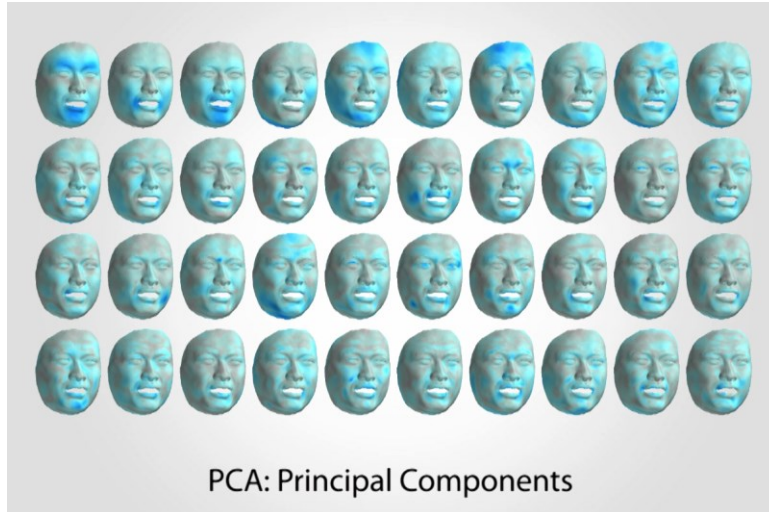
Blend Shape Model

- Linear blend of artist defined deformations from rest shape



Christian Theobalt

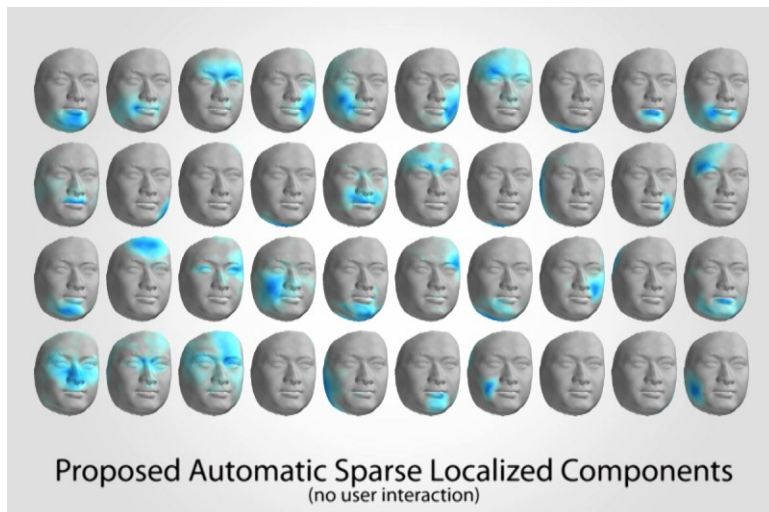
Sparse Localized Deformation Components



T. Neumann, K. Varanasi, S. Wenger, M. Wacker, M. Magnor, C. Theobalt,
Sparse localized deformation components, *ACM TOG (SIGGRAPH ASIA) 2013*

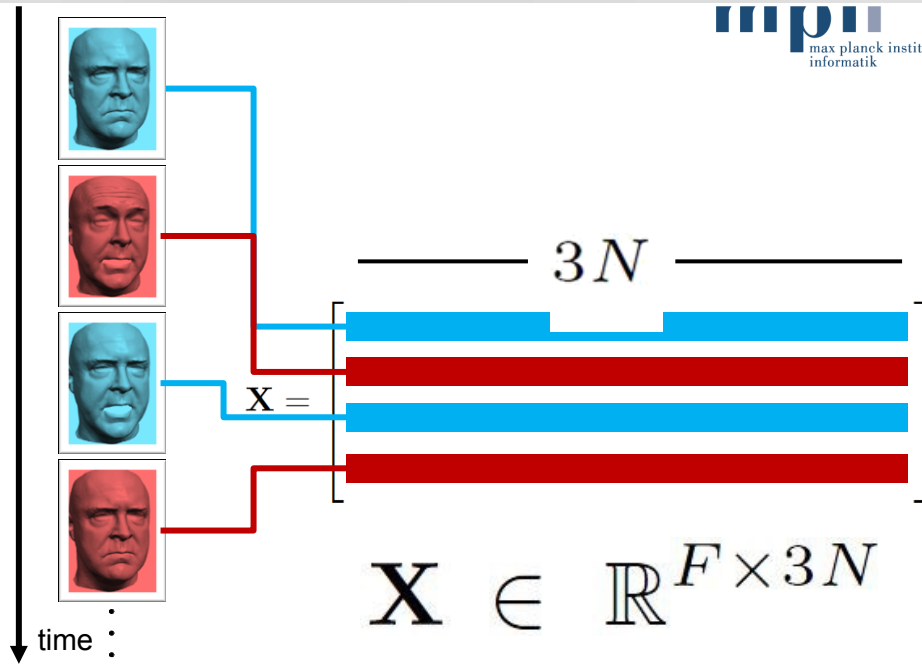
Christian Theobalt

Sparse Localized Deformation Components

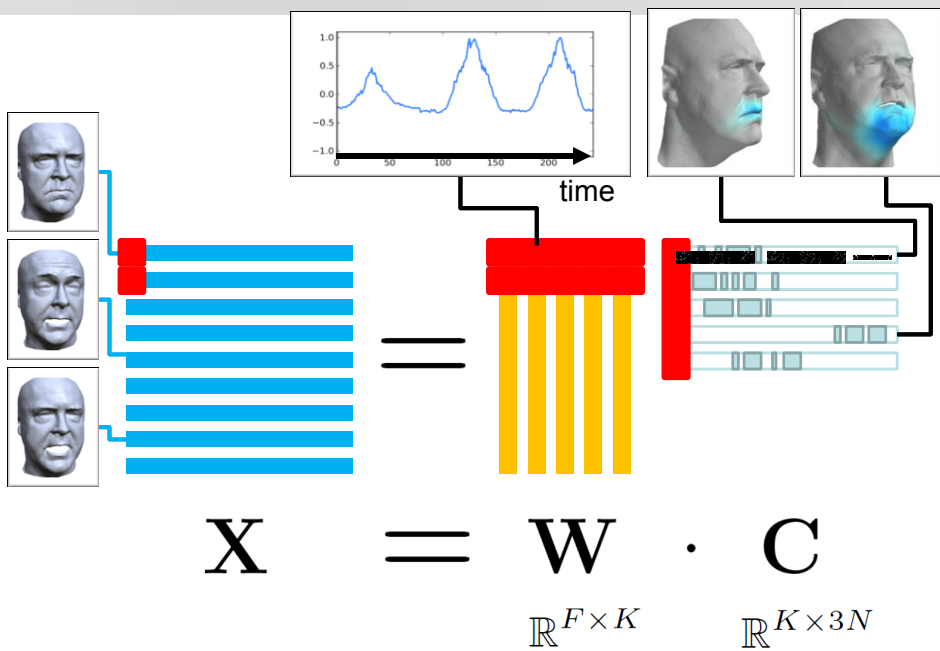


T. Neumann, K. Varanasi, S. Wenger, M. Wacker, M. Magnor, C. Theobalt,
Sparse localized deformation components, *ACM TOG (SIGGRAPH ASIA) 2013*

Christian Theobalt



Christian Theobalt



Christian Theobalt

$$\min_{\mathbf{W}, \mathbf{C}} \|\mathbf{X} - \mathbf{W} \cdot \mathbf{C}\|_F^2 \quad \text{Data Term}$$

$$+ \sum_{k=1}^K \sum_{i=1}^N \|\mathbf{c}_k^{(i)}\|_2$$

$$\text{subject to } \max_j |W_{j,k}| = 1$$

Christian Theobalt



$$+ \sum_{k=1}^K \sum_{i=1}^N \|\mathbf{c}_k^{(i)}\|_2$$

Sparse, but not localized

Christian Theobalt




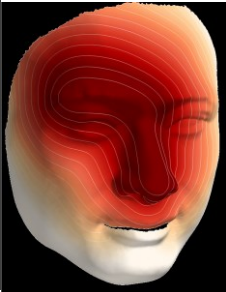

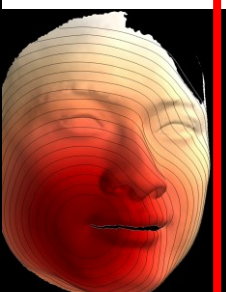
$$+ \sum_{k=1}^K \sum_{i=1}^N \Lambda_k^{(i)} \| \mathbf{c}_k^{(i)} \|_2$$

Sparse and **localized**

Christian Theobalt

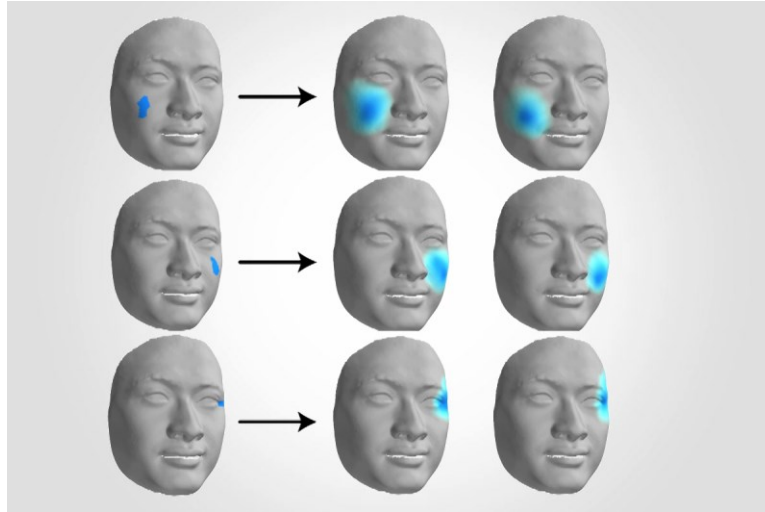
Support Maps

- Geodesic distance to center vertices (on rest shape)

User Interaction (rough binary mask)		Automatic (adjusted during optimization)	
			
User Scribble	Support Map		Support Map

Christian Theobalt

Sparse Localized Deformation Components



T. Neumann, K. Varanasi, S. Wenger, M. Wacker, M. Magnor, C. Theobalt,
Sparse localized deformation components, *ACM TOG (SIGGRAPH ASIA) 2013*

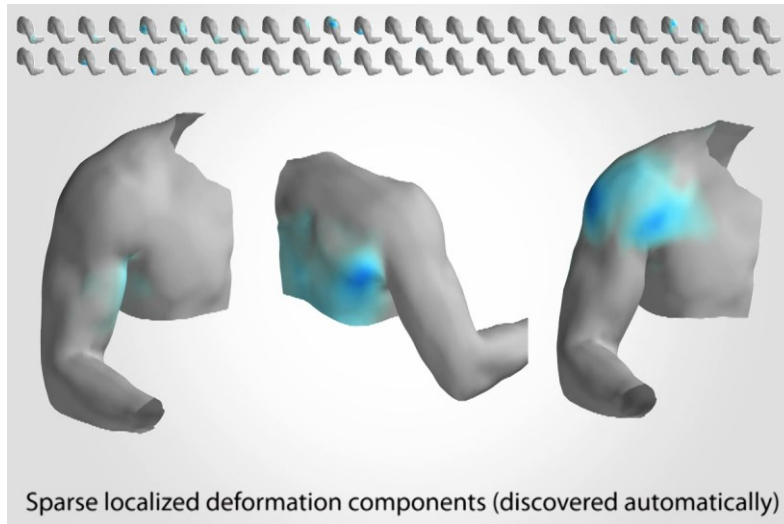
Christian Theobalt

New Animation



Christian Theobalt

“Physiological” Components



Christian Theobalt

Conclusions

- 4D reconstruction has made great progress
- Many open challenges until we capturing reality
- Needed: Rethinking foundations of 4D reconstruction
- First steps:
 - Estimation and exploitation of more expressive light transport models
 - New parameterizations of dynamic scenes

Christian Theobalt

Thank You !



gvv.mpi-inf.mpg.de



www.thecapture.com

Thanks to:



ERC Starting Grant
CapReal

Christian Theobalt