

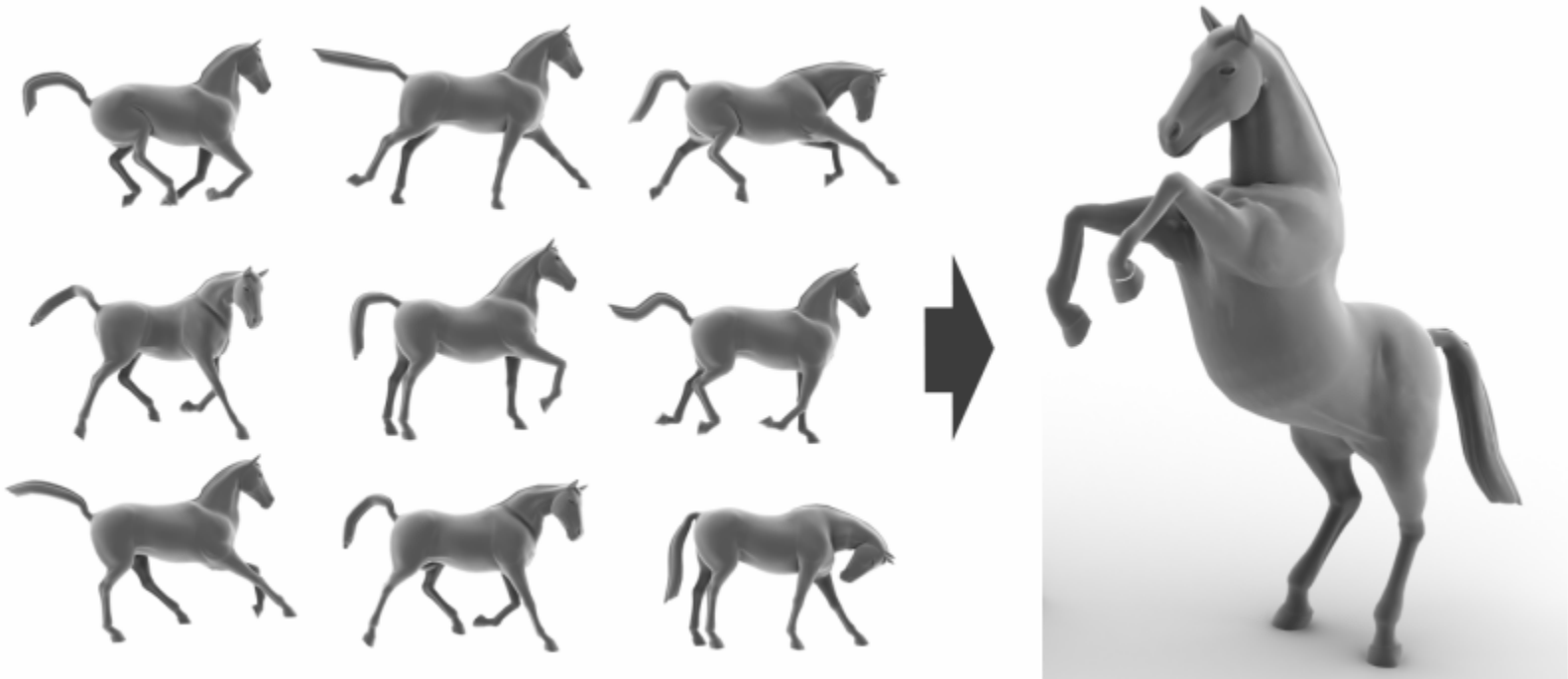
Example-Based Skeleton Extraction

Scott Schaefer

Can Yuksel

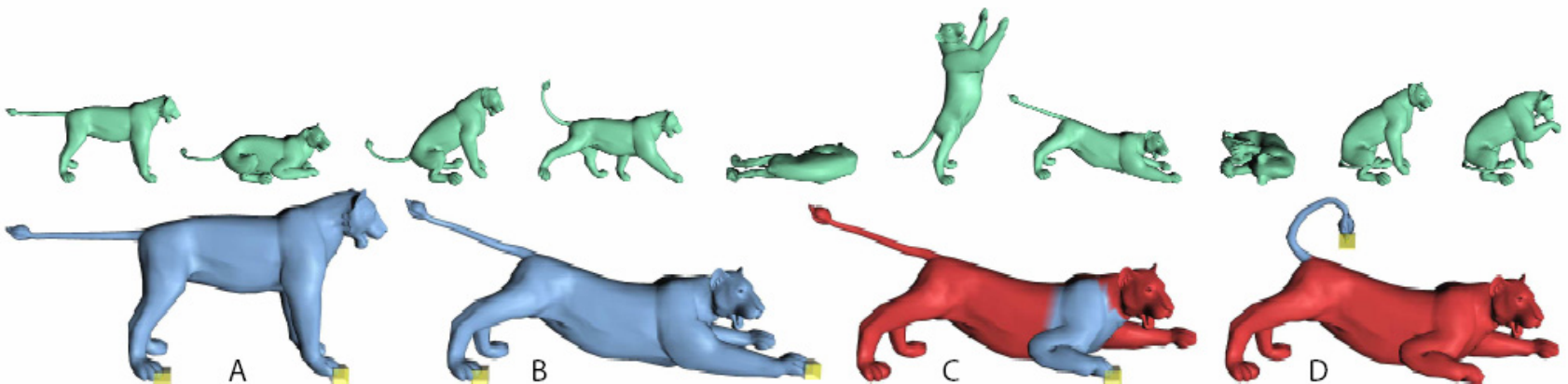
Example-Based Deformation

Examples



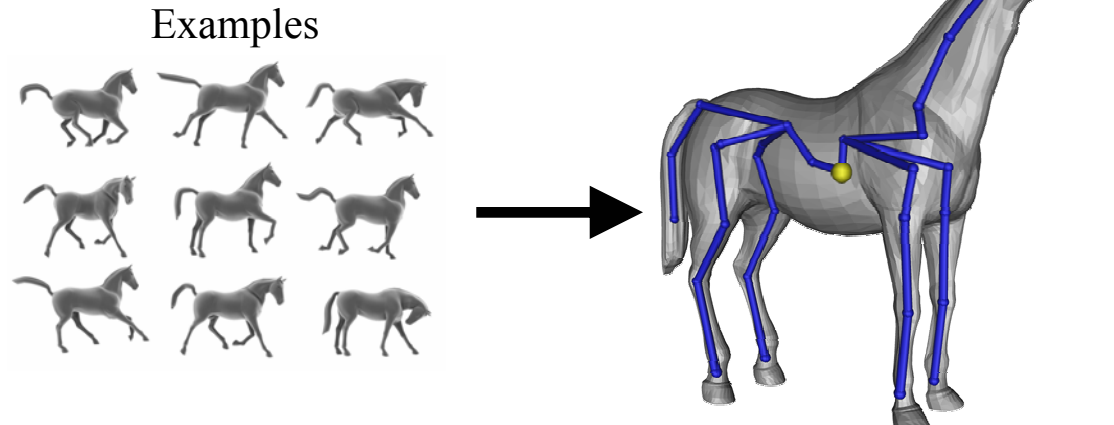
Previous Work

- Mesh-based Inverse Kinematics [[Sumner et al. 2005](#)], [[Der et al. 2006](#)]
 - ◆ Example-based deformation method
 - ◆ Non-linear minimization
 - ◆ Not real-time



Objective

- Determine parameters for skeletal animation from set of examples
 - ◆ Bone transformations
 - ◆ Vertex weights
 - ◆ Bone connectivity
 - ◆ Joint locations
 - ◆ Root node



Previous Work

- Skeleton from shape decomposition
 - ◆ [Katz, Tal 2003]
 - ◆ [de Aguilar et al. 2004]
 - ◆ [Theobalt et al. 2004]
 - ◆ [Katz et al. 2005]
 - ◆ [Lien et al. 2006]



Image taken from [Lien et al. 2006]

Previous Work

■ Skeleton from shape decomposition

- ◆ [Katz, Tal 2003]
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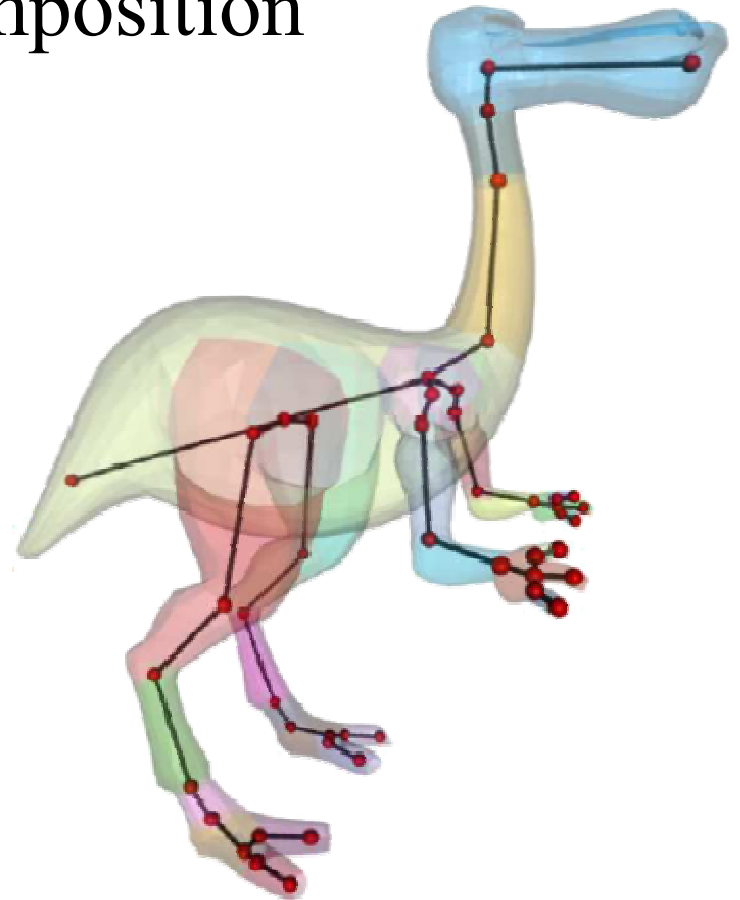


Image taken from [Lien et al. 2006]

Previous Work

- Example-based skinning
 - ◆ [[Wang et al. 2002](#)]
 - ◆ [[Mohr, Gleicher 2003](#)]



Image taken from [[Wang et al. 2002](#)]

Previous Work

- Skinning Mesh Animations [[James, Twigg 2005](#)]
 - ◆ Robust face clustering for bone estimation
 - ◆ Non-negative least squares for weights
 - ◆ Compresses animations for display on GPU
 - ◆ No connectivity/hierarchy/joint positions



Previous Work

- Skeletons from real world data
 - ◆ [Kurihara, Miyata 2004]
 - ◆ [Anguelov et al. 2004]
 - ◆ [Kirk et al. 2005]

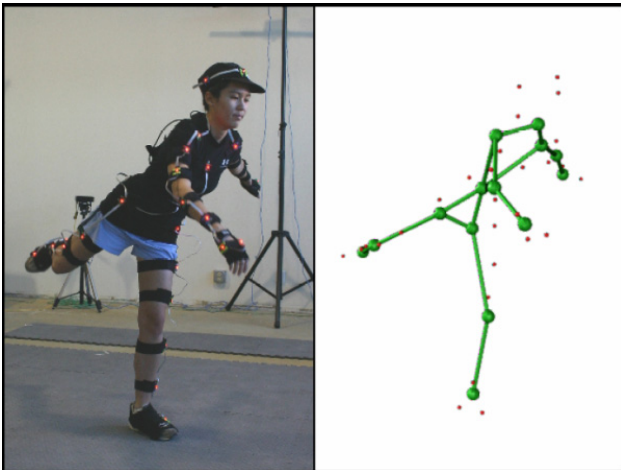


Image taken from [Kirk et al. 2005]



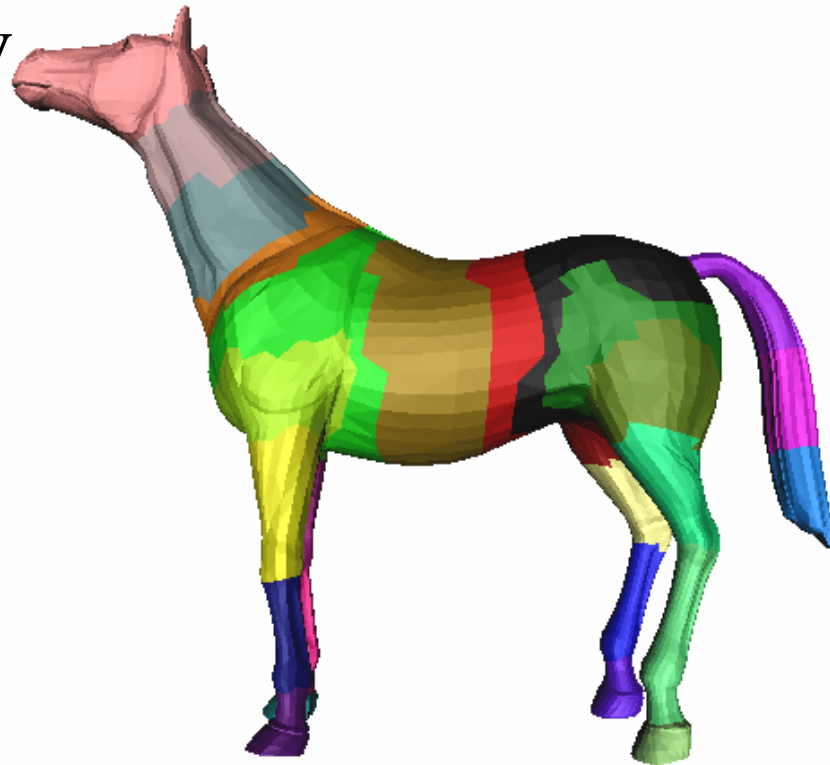
Image taken from [Kurihara, Miyata 2004]

Outline

- Bone estimation
- Skinning
- Finding bone connectivity
- Estimating joint locations

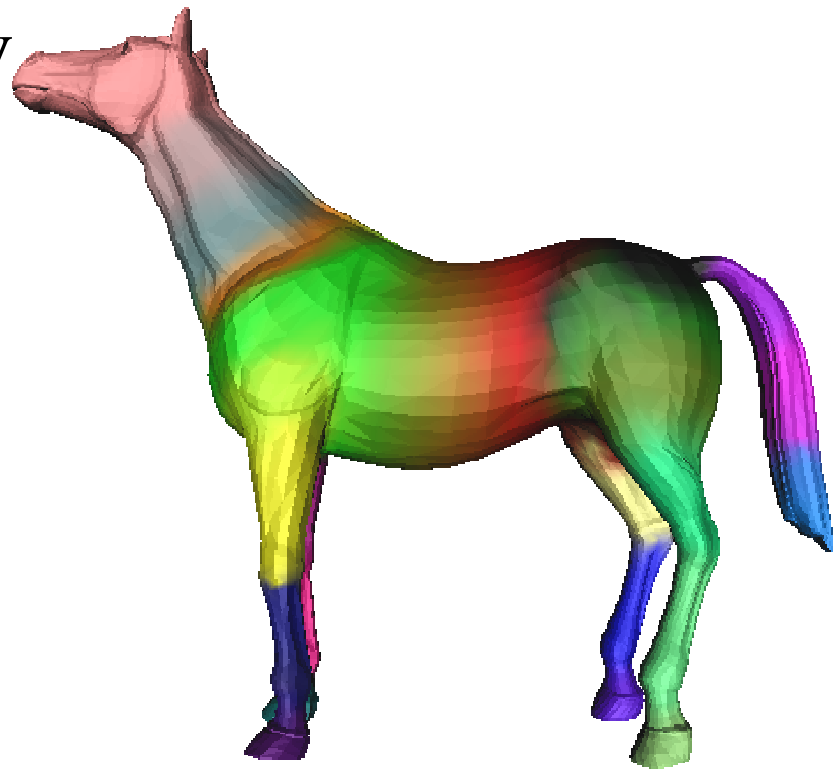
Outline

- Bone estimation
- Skinning
- Finding bone connectivity
- Estimating joint locations



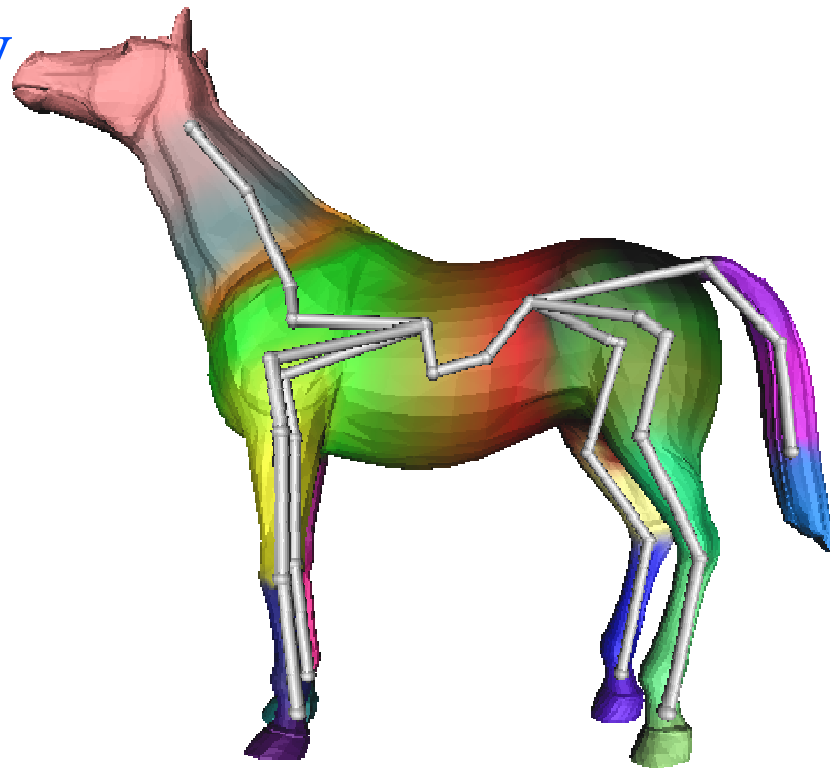
Outline

- Bone estimation
- **Skinning**
- Finding bone connectivity
- Estimating joint locations



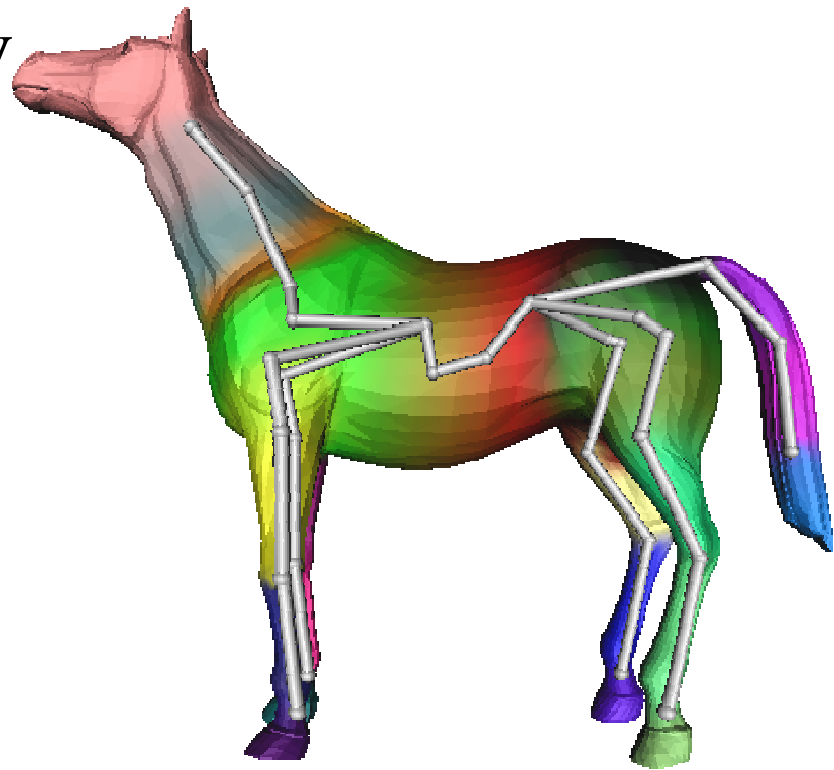
Outline

- Bone estimation
- Skinning
- Finding bone connectivity
- Estimating joint locations



Outline

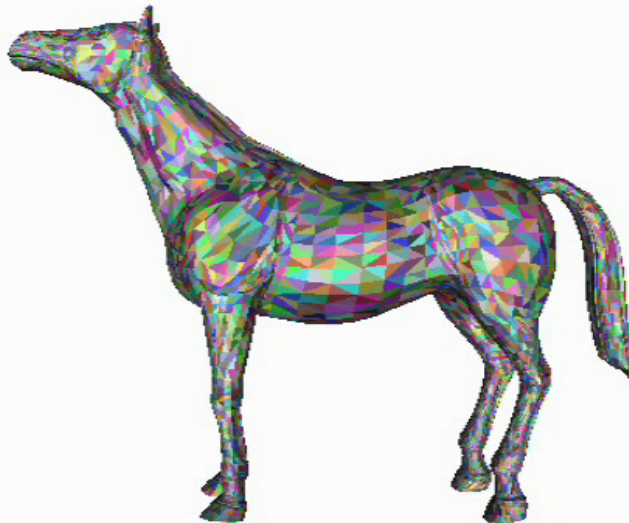
- Bone estimation
- Skinning
- Finding bone connectivity
- Estimating joint locations



Bone Estimation

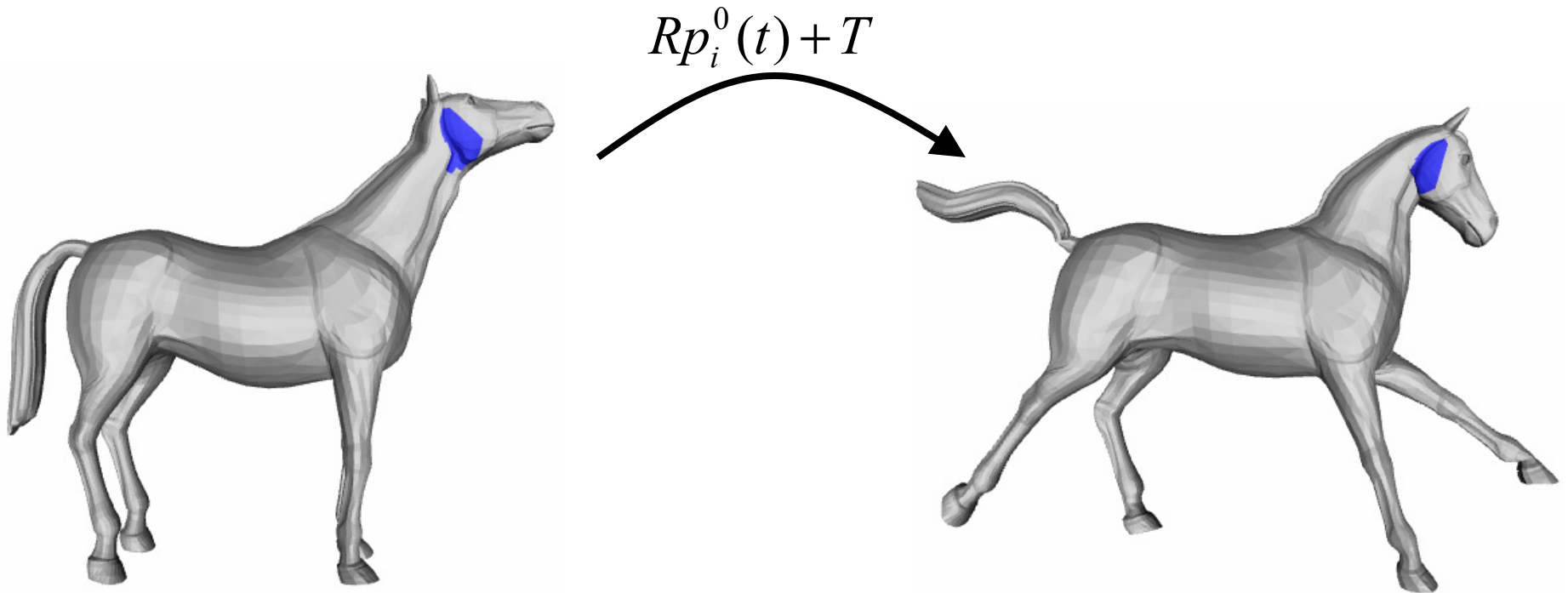
- Cluster faces that transform in the same rigid manner

Clustering



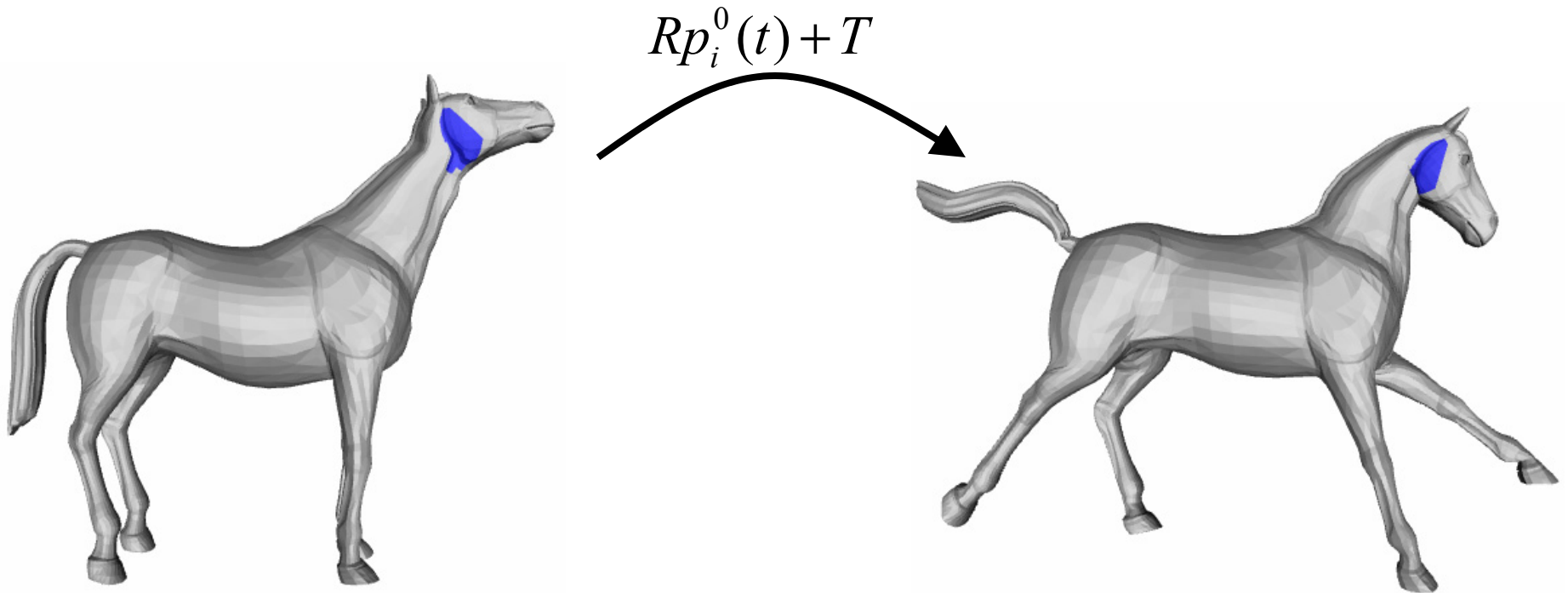
Rigid Error Functions

$$\min_{R^T R = I, T} \sum_i \int_t \left| R p_i^0(t) + T - p_i^k(t) \right|^2 dt$$



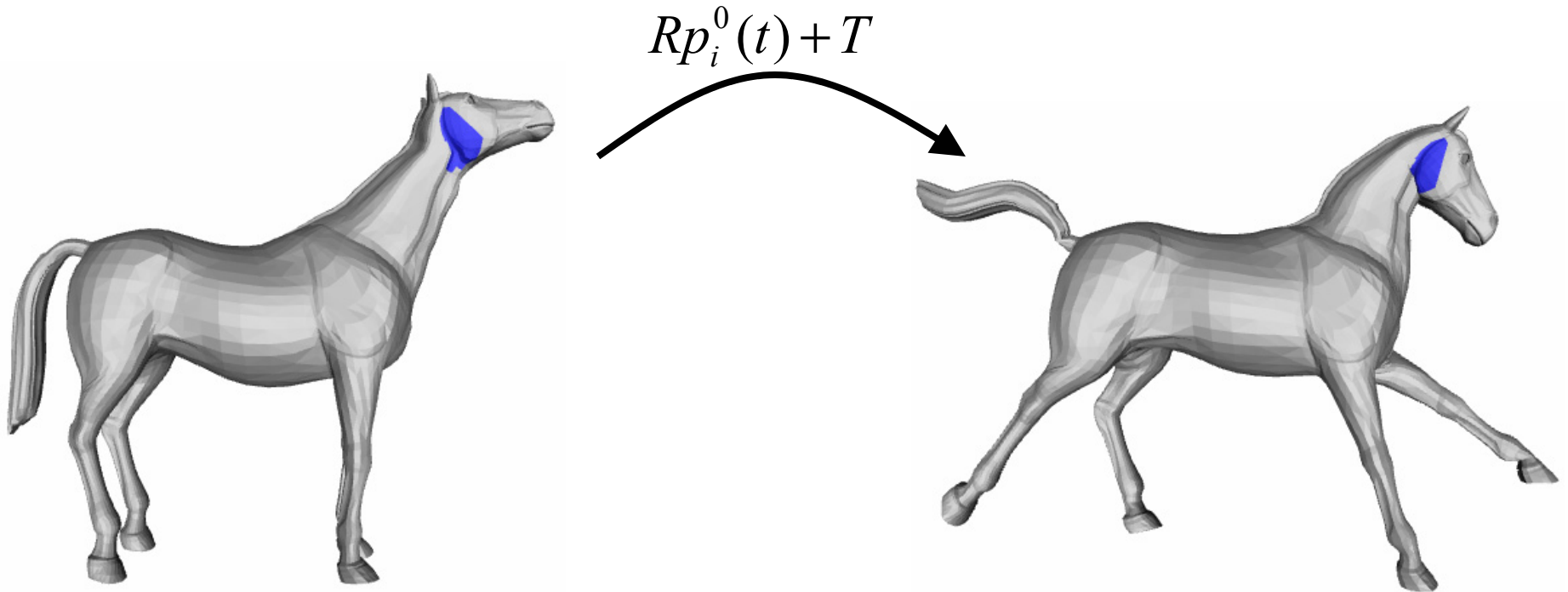
Rigid Error Functions

$$T = \bar{p}^k - R\bar{p}^0 \quad \text{where} \quad \bar{p}^k = \frac{\sum_i \int_t p_i^k(t) dt}{\sum_i \int_t dt}$$



Rigid Error Functions

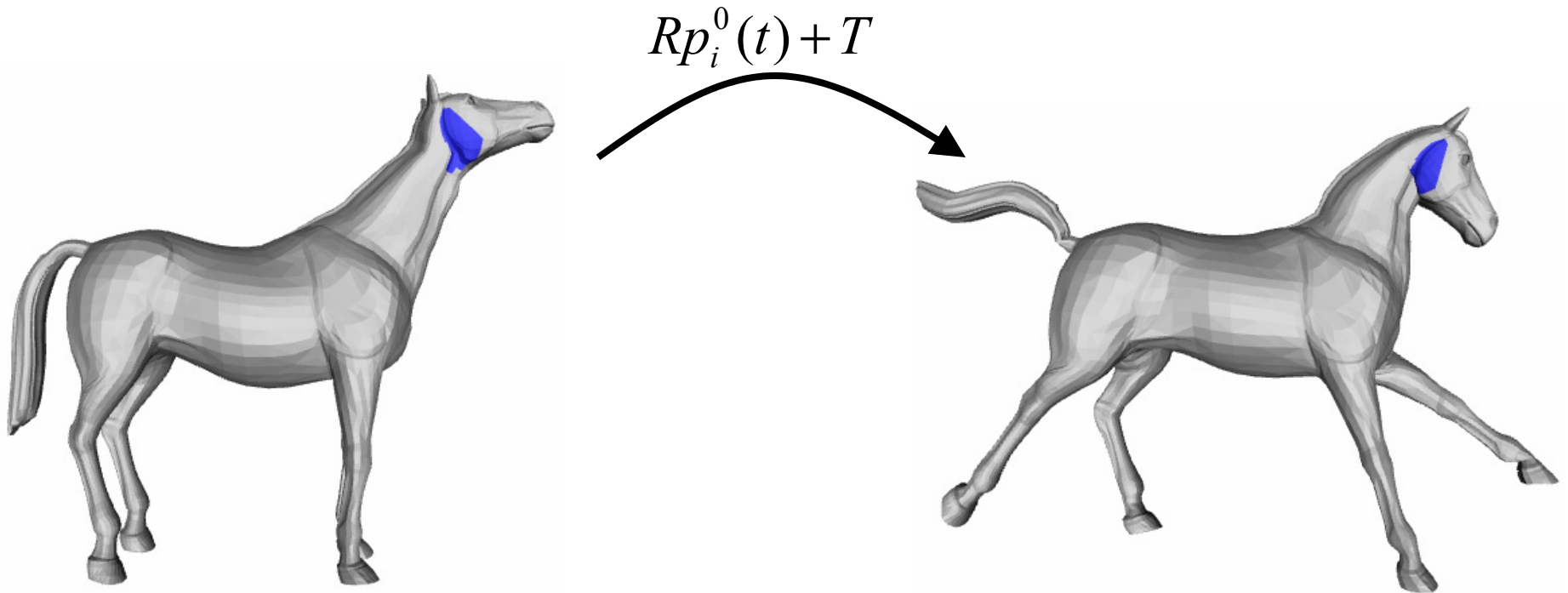
$$M = \int_t \hat{p}_i^0(t) \hat{p}_i^k(t)^T dt \quad \text{where} \quad \hat{p}_i^k(t) = p_i^k(t) - \bar{p}_i^k$$



Rigid Error Functions

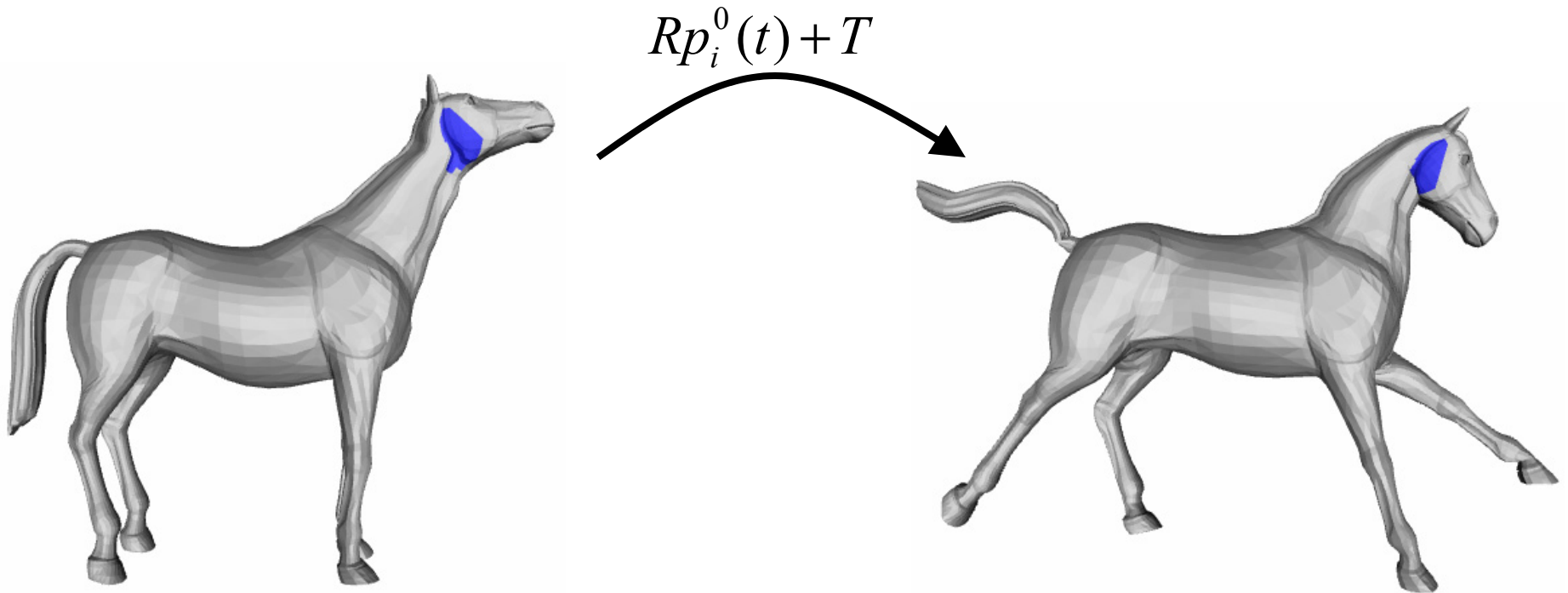
$$M = RS \quad \text{where} \quad S = S^T \quad \text{and} \quad R^T R = I$$

[Shoemake et al. 1992], [Alexa et al. 2000], [Müller et al. 2005]



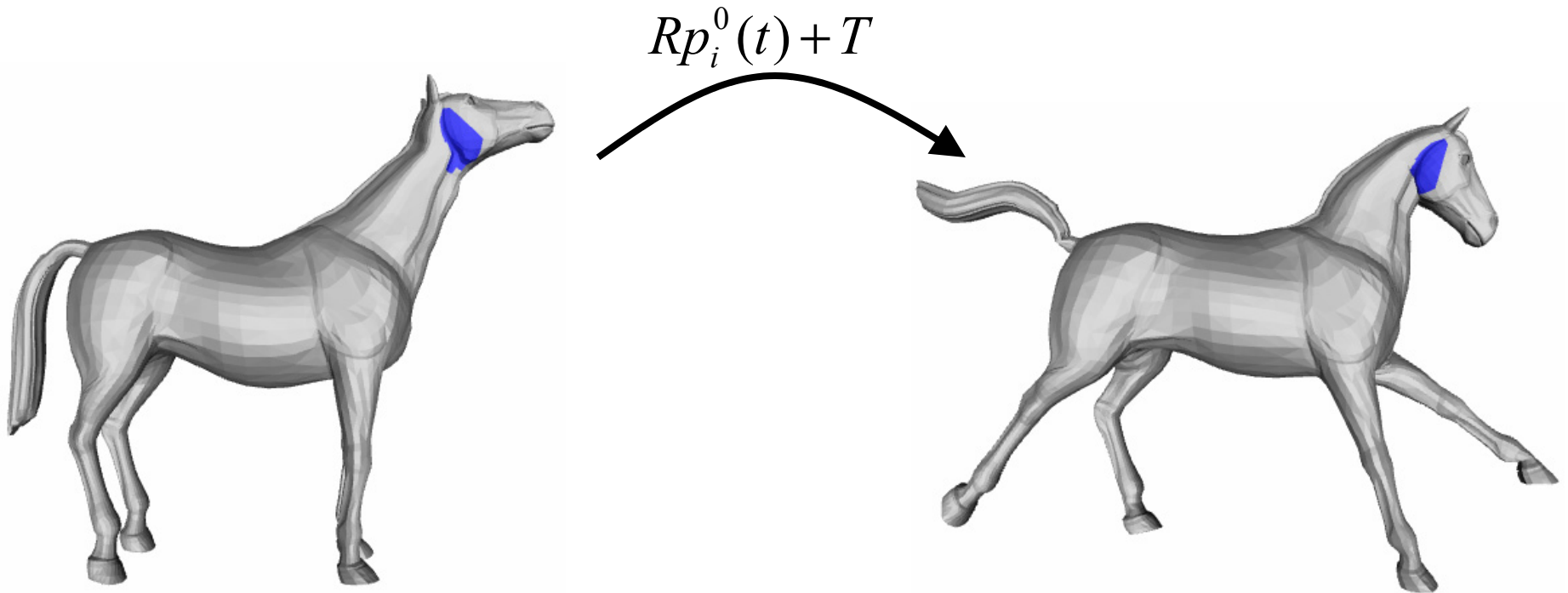
Rigid Error Functions

- Eigen decomposition of 4x4 matrix [[Horn 1987](#)]



Rigid Error Functions

- Compact representation (17 floats)

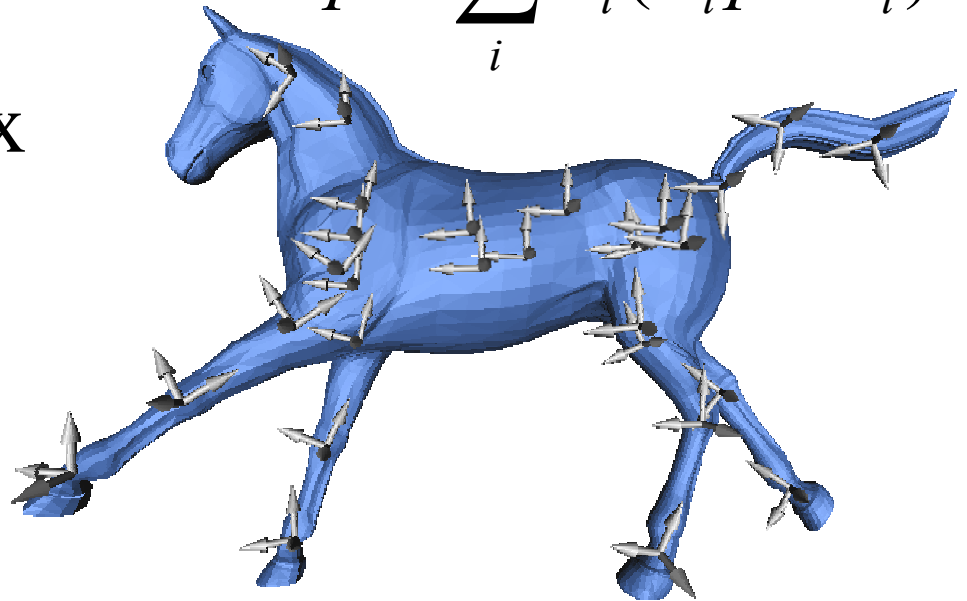


Skin Weights

■ Weight properties:

- ◆ Match the motion of the example poses
- ◆ Translation invariant
- ◆ Four or less bone weights per vertex
- ◆ Positive weights

$$\hat{p} = \sum_i \alpha_i (R_i p + T_i)$$



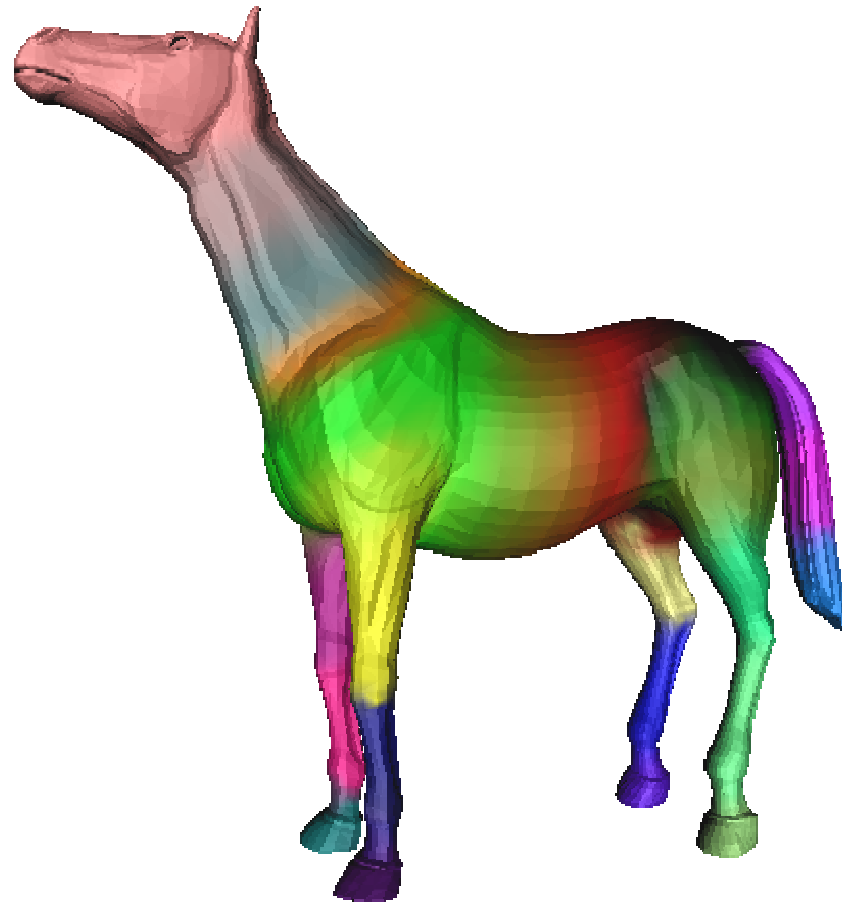
Skin Weights



Skin Weights



Skin Weights



Skin Weight Validation

Example
Poses

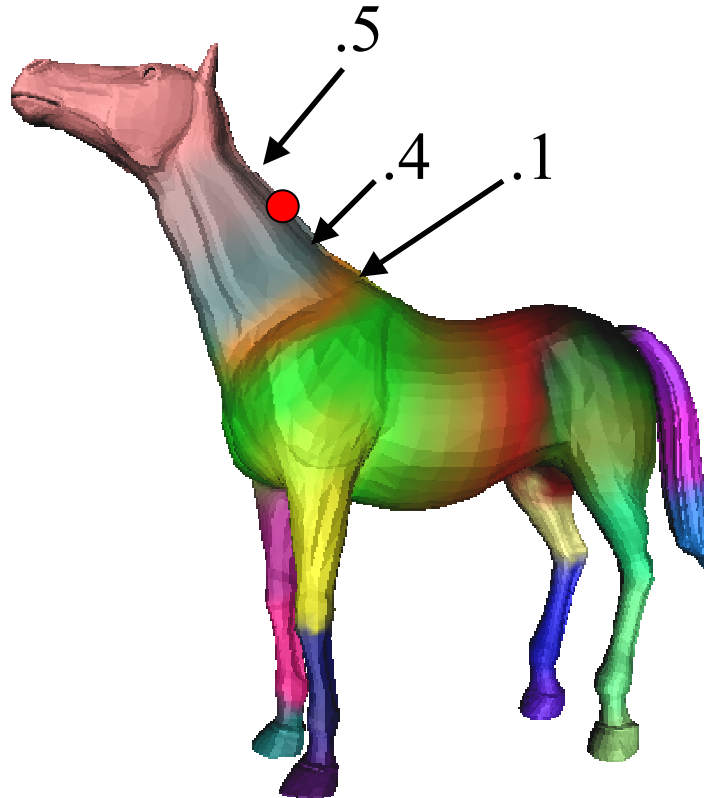


Skeleton
Generated
Poses



Bone Connectivity

- Vertex weights indicate information about bone connectivity!!!



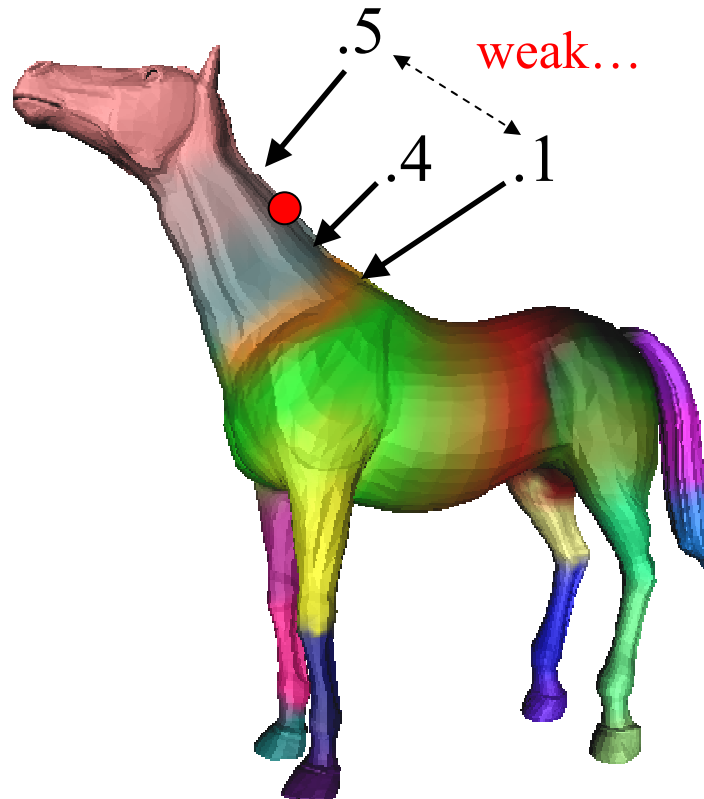
Bone Connectivity

- Vertex weights indicate information about bone connectivity!!!



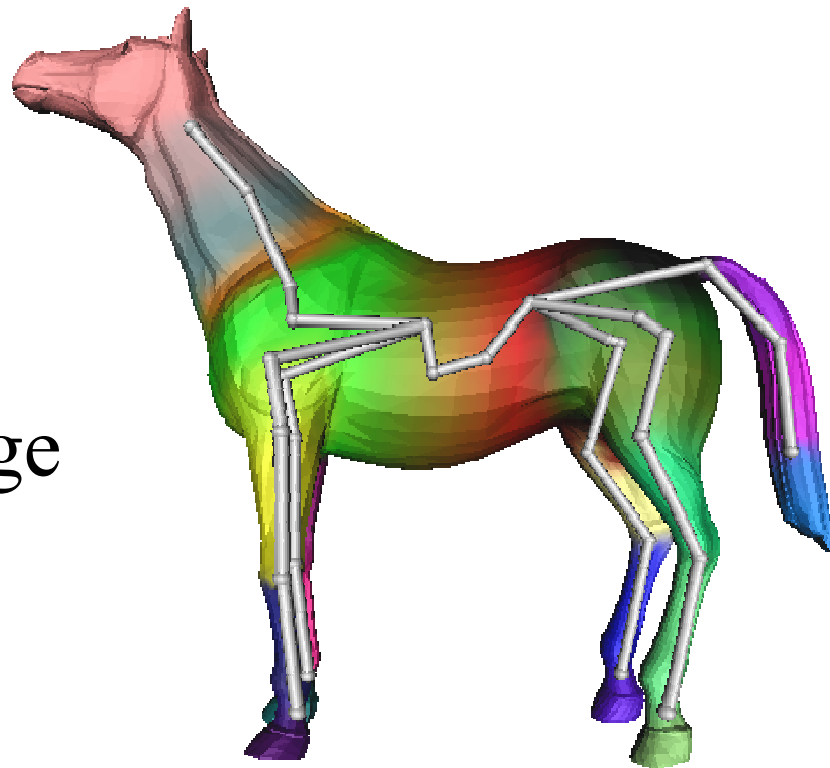
Bone Connectivity

- Vertex weights indicate information about bone connectivity!!!

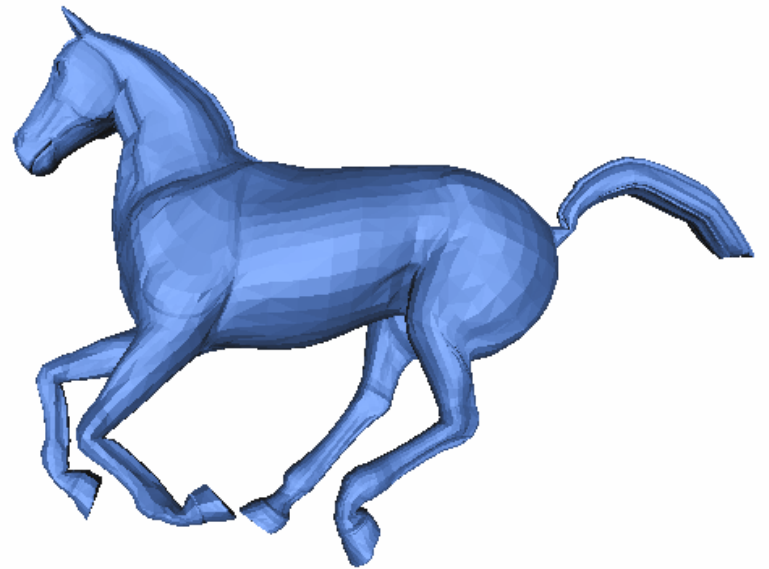
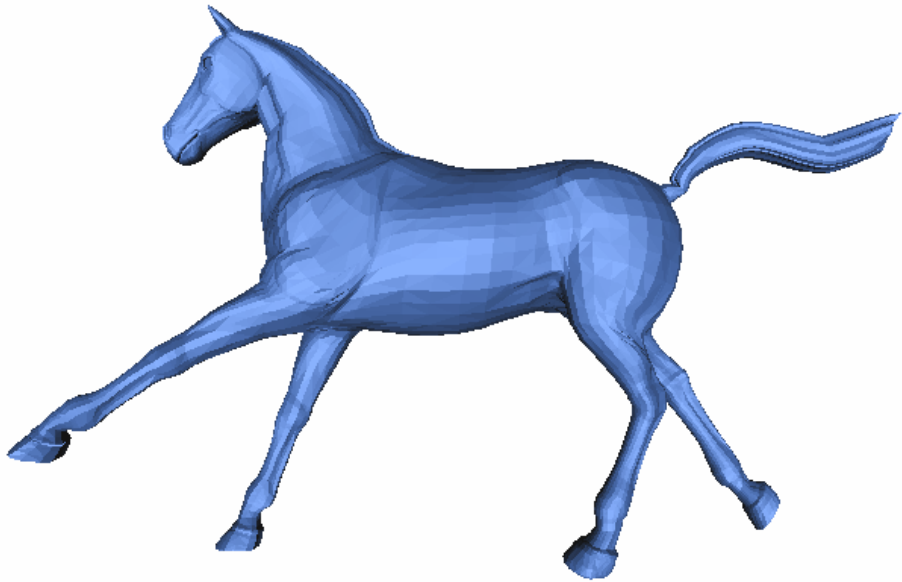


Bone Connectivity

- Extract maximal spanning tree to determine connectivity
- For each vertex
 - ◆ For each bone weight
 - ◆ Let α_{max} be the maximum weight
 - ◆ Add weight α_j to edge between (max, j)

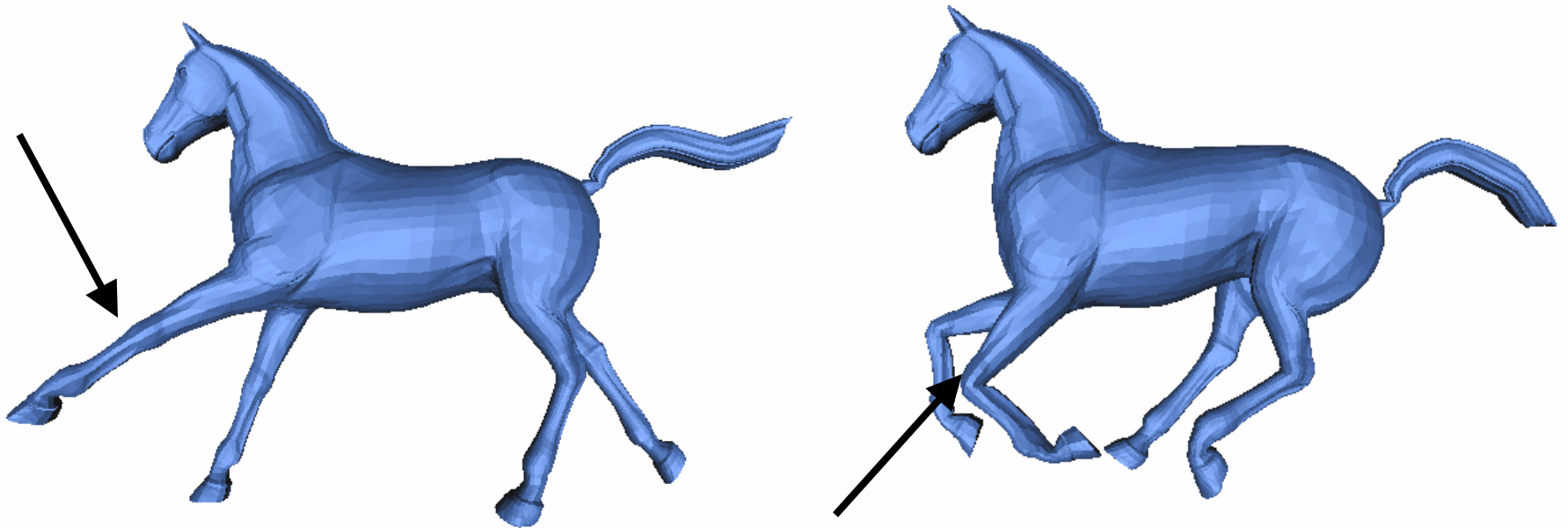


Joint Locations



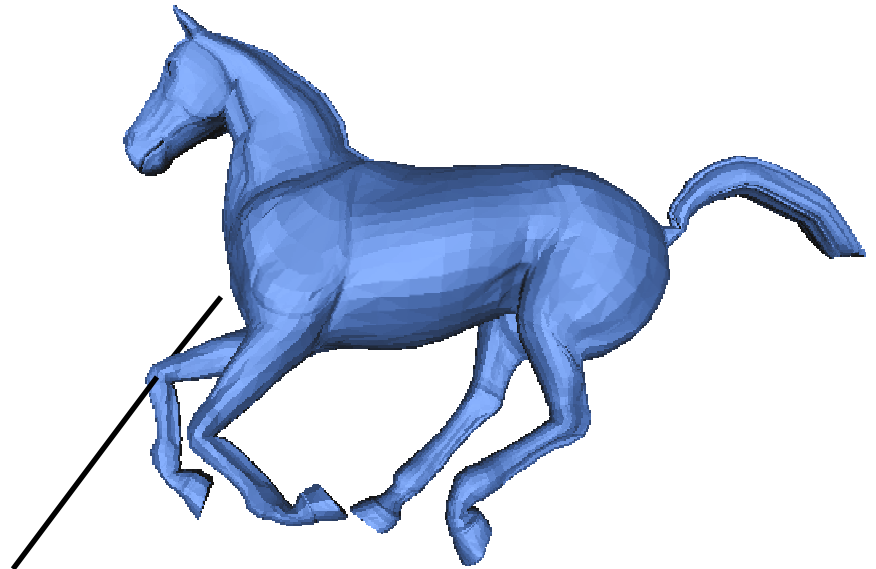
Joint Locations

- Joint has same position with respect to both bone transformations



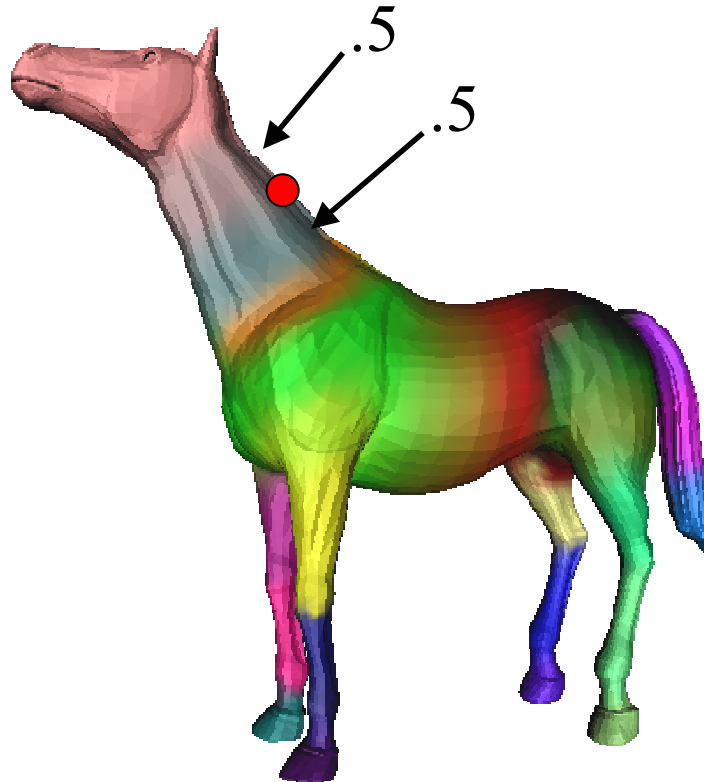
Joint Locations

- Many joints act as hinges and bend along an axis
- Yields infinite number of solutions to minimization!!!



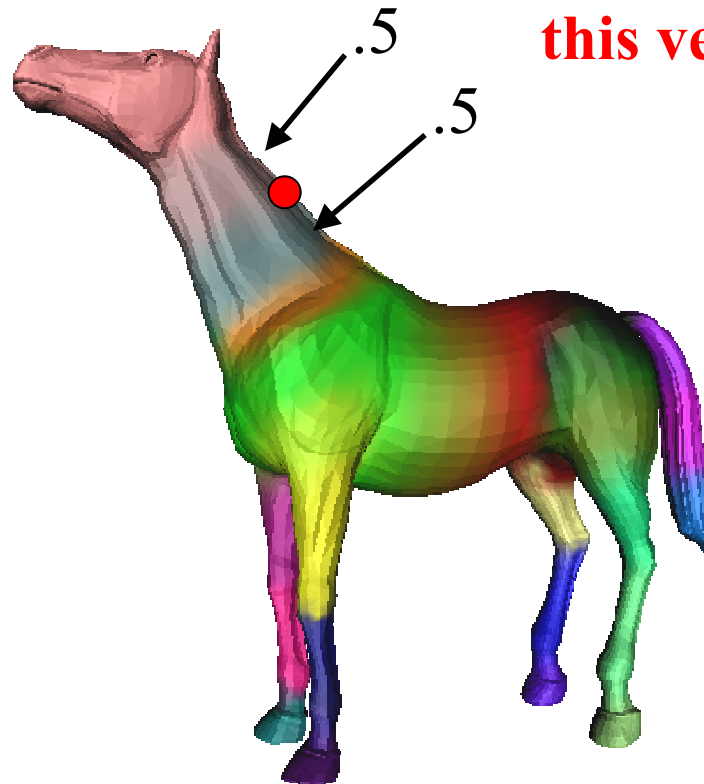
Joint Locations

- Vertex weights indicate information about joint locations!!!



Joint Locations

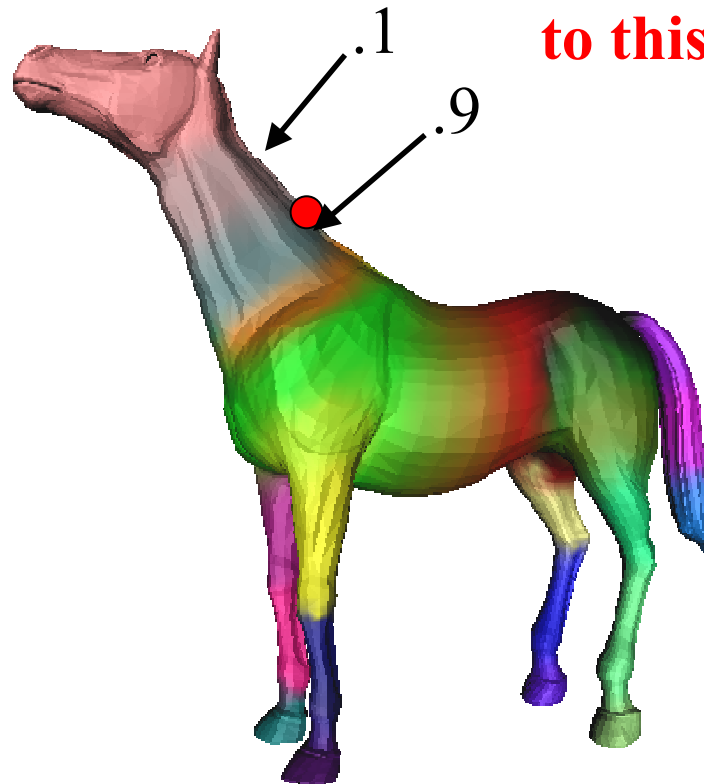
- Vertex weights indicate information about joint locations!!!



**Joint close to
this vertex**

Joint Locations

- Vertex weights indicate information about joint locations!!!

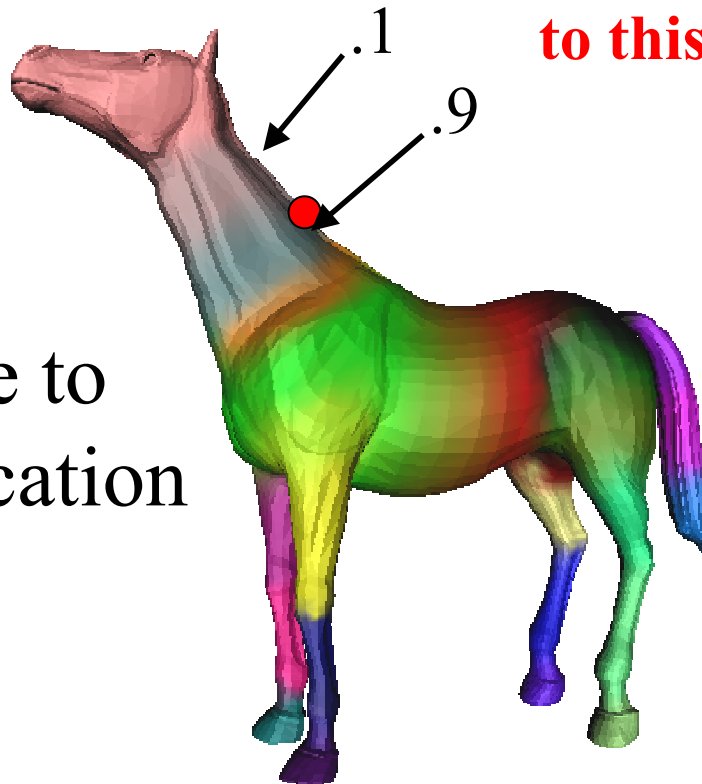


**Joint not close
to this vertex**

Joint Locations

- Vertex weights indicate information about joint locations!!!

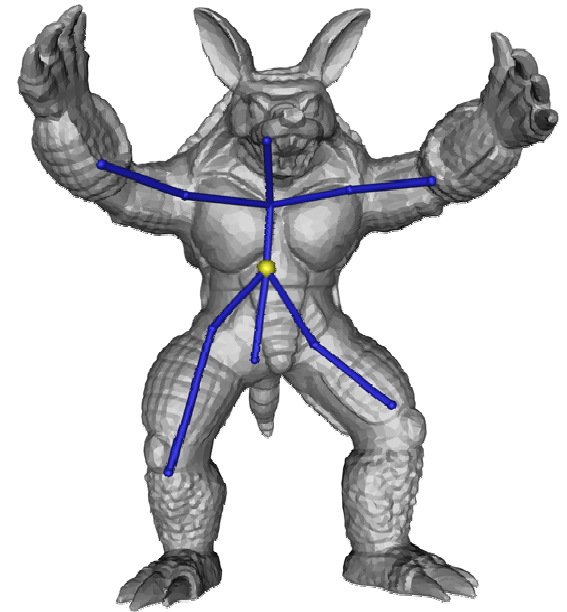
Minimize distance to
estimated joint location



**Joint not close
to this vertex**

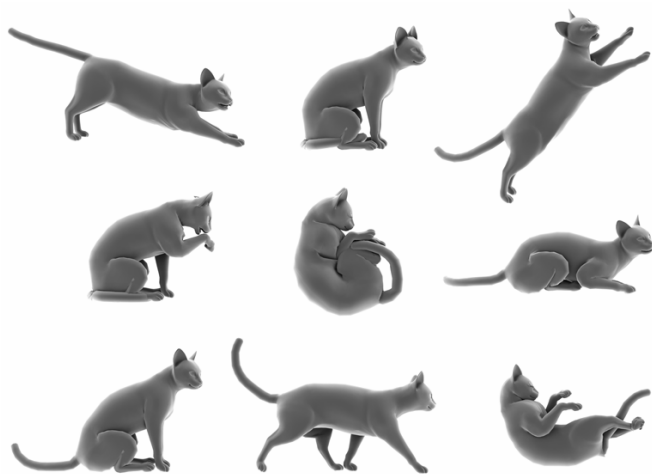
Root of Skeleton

- Very arbitrary...
- We choose bone closest to center of mass
- Center of mass important in physical calculations so makes sense to set root there



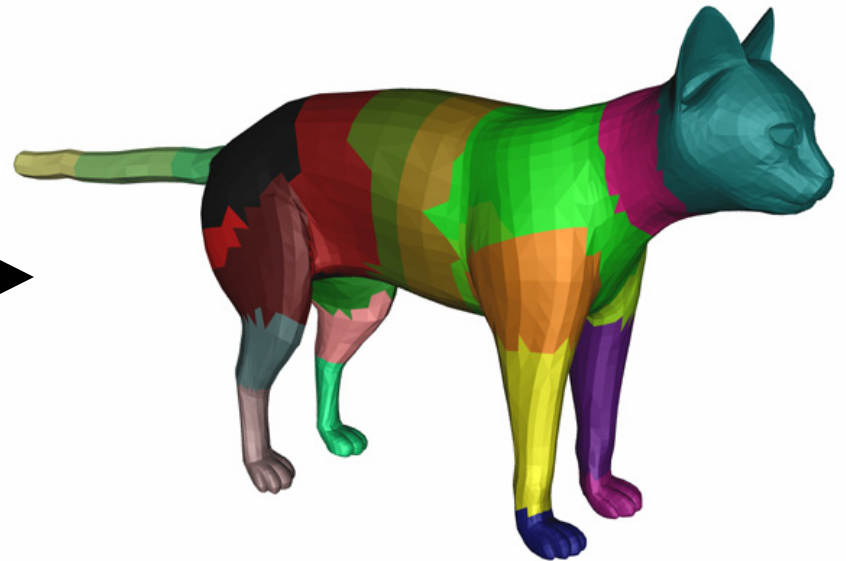
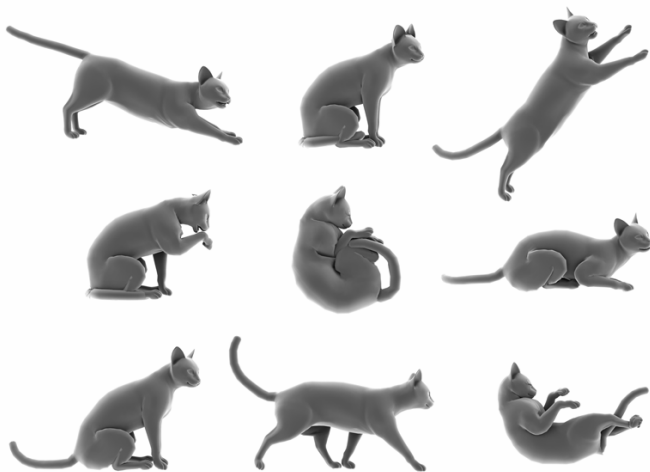
Results

Examples



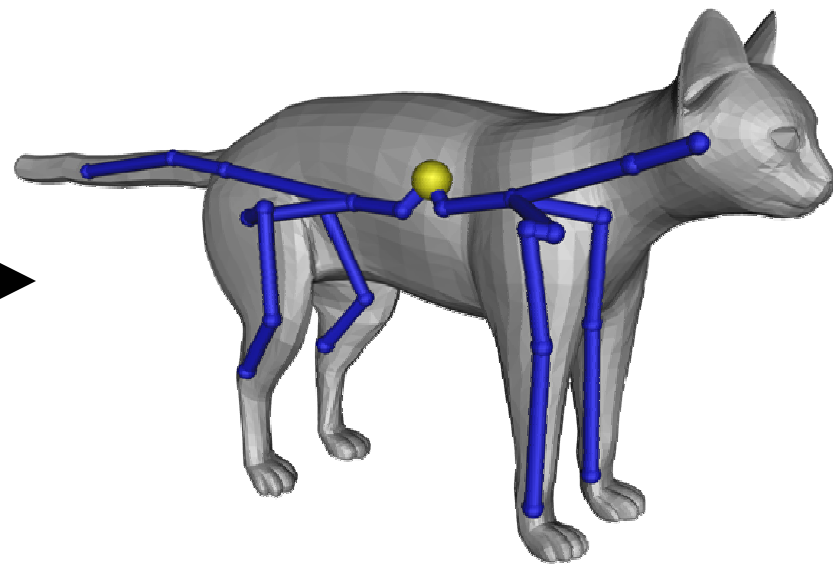
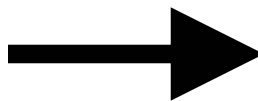
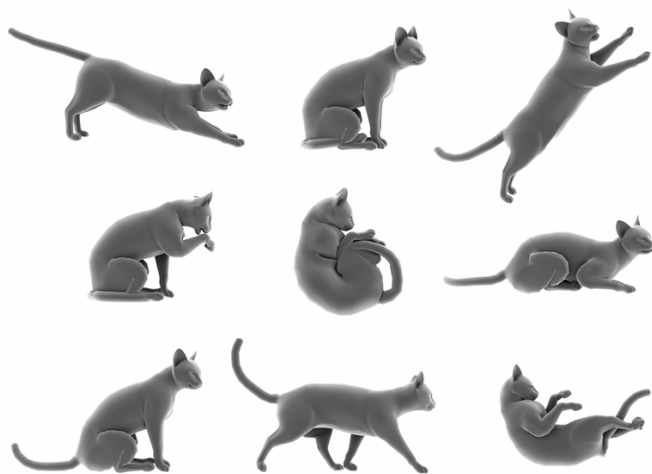
Results

Examples

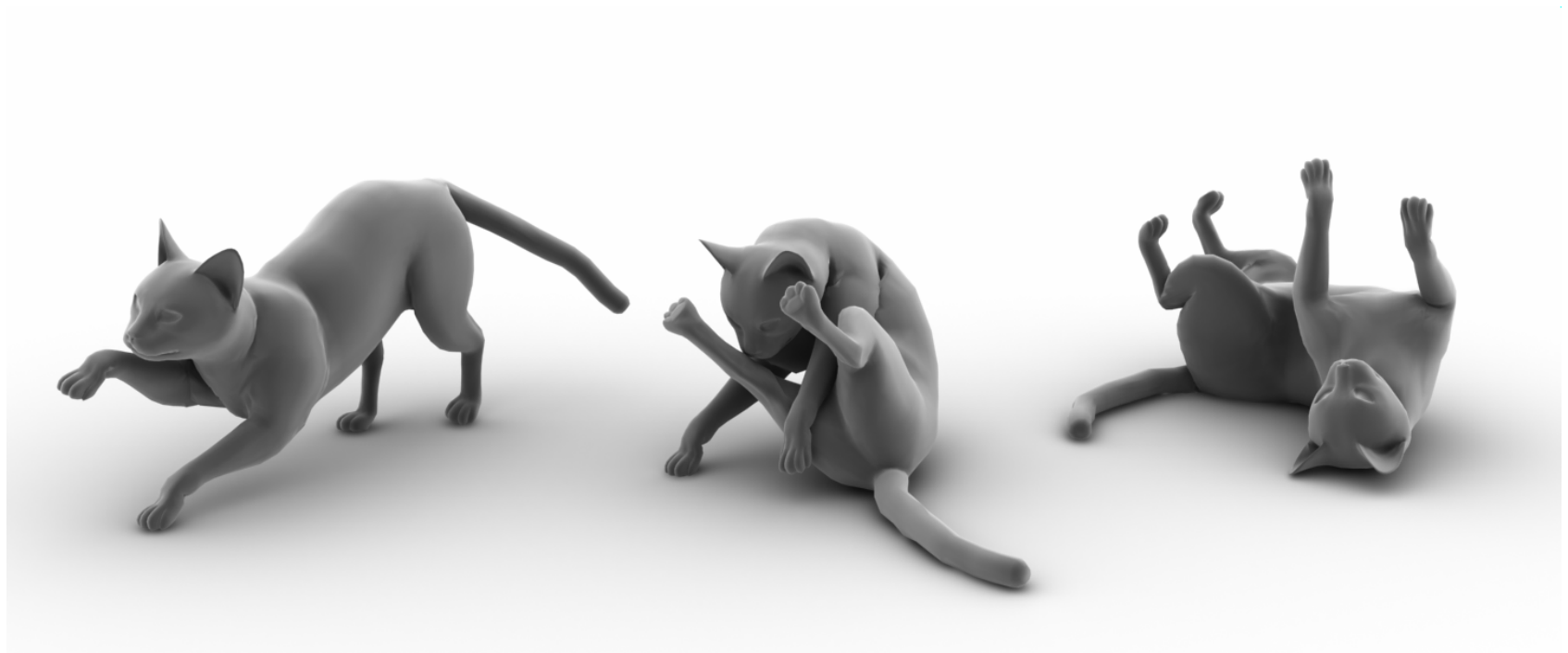


Results

Examples



Results



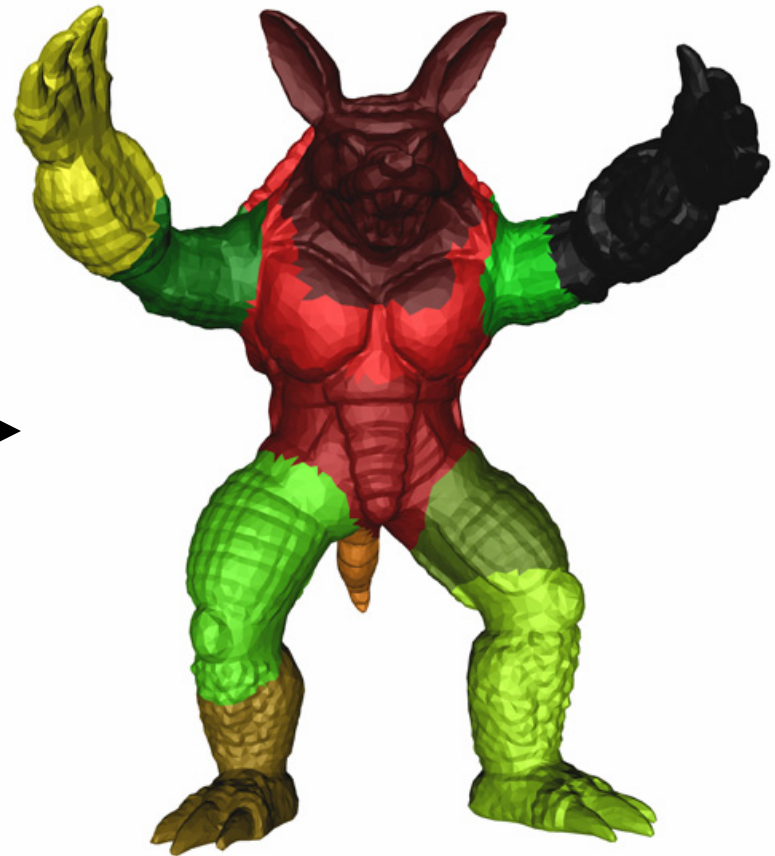
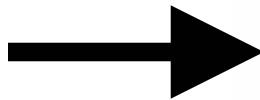
Results

Examples



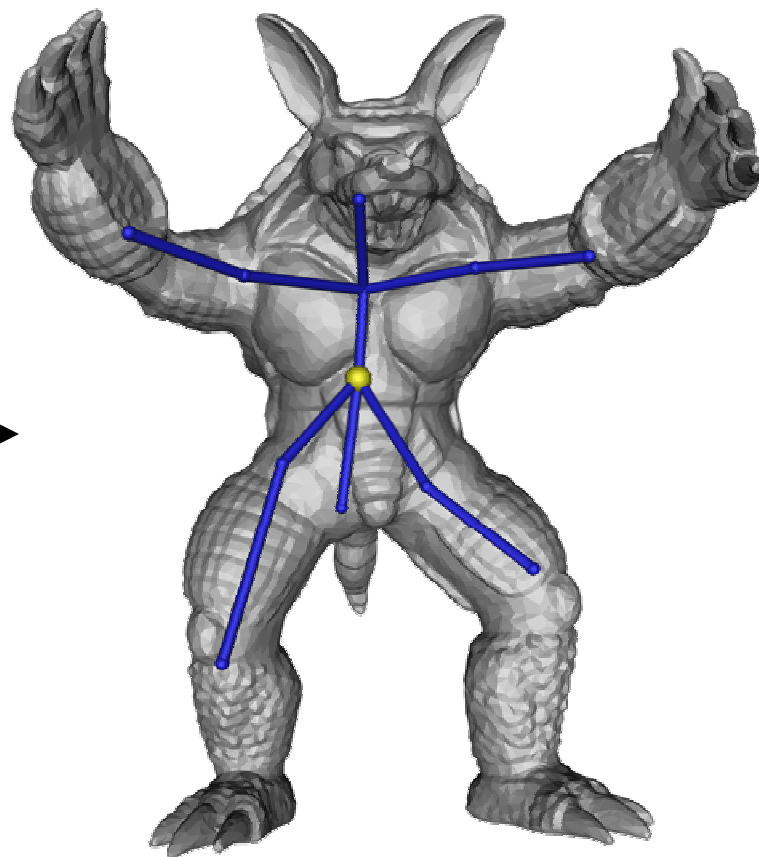
Results

Examples



Results

Examples

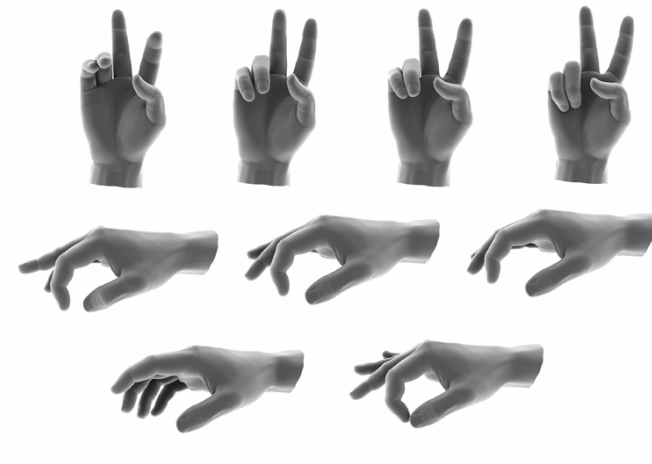


Results



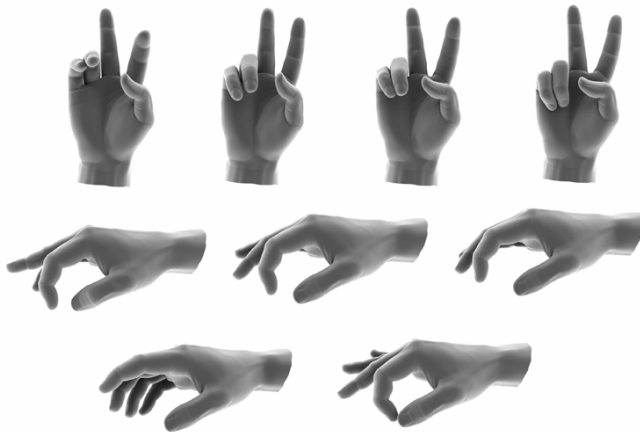
Results

Examples



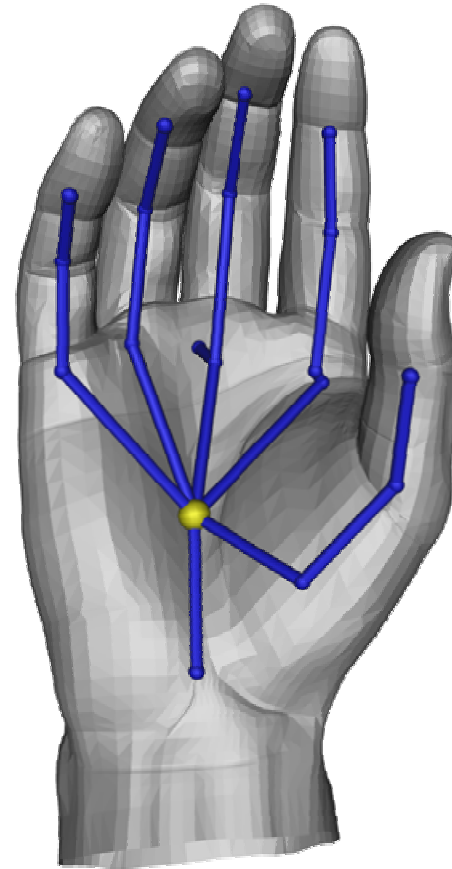
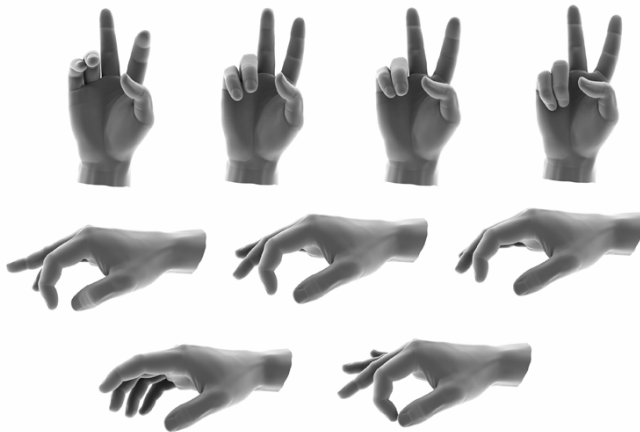
Results

Examples



Results

Examples

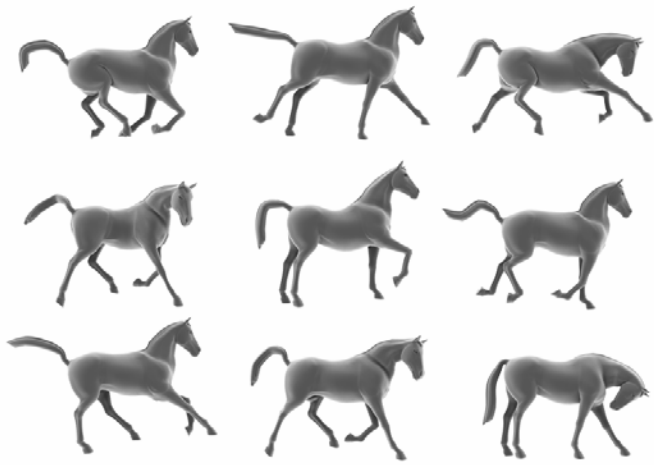


Results



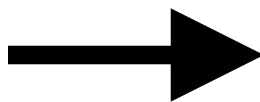
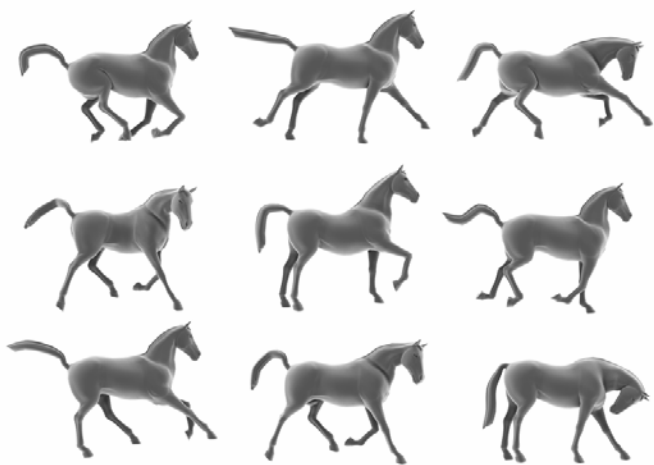
Results

Examples



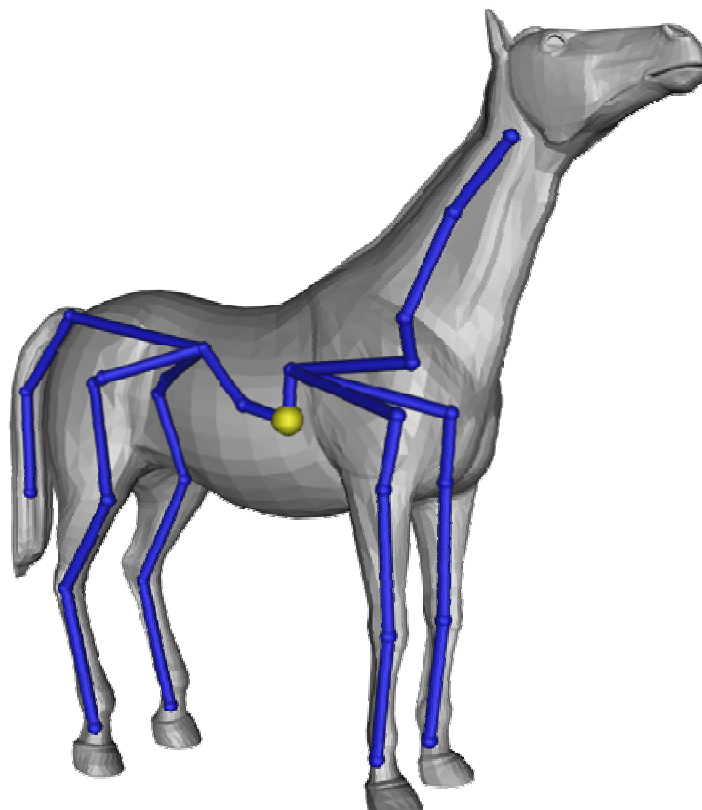
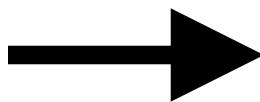
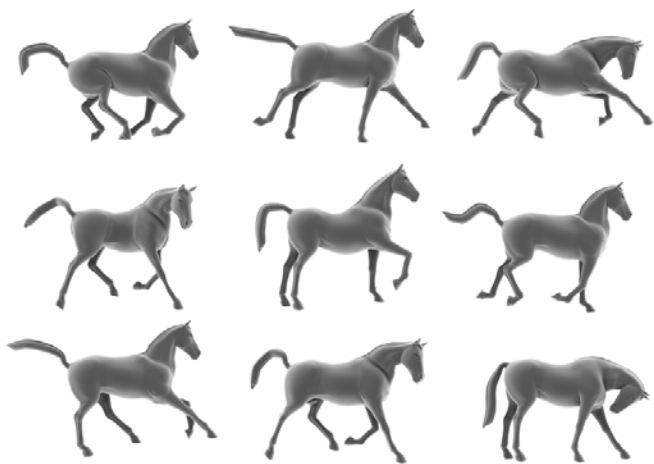
Results

Examples

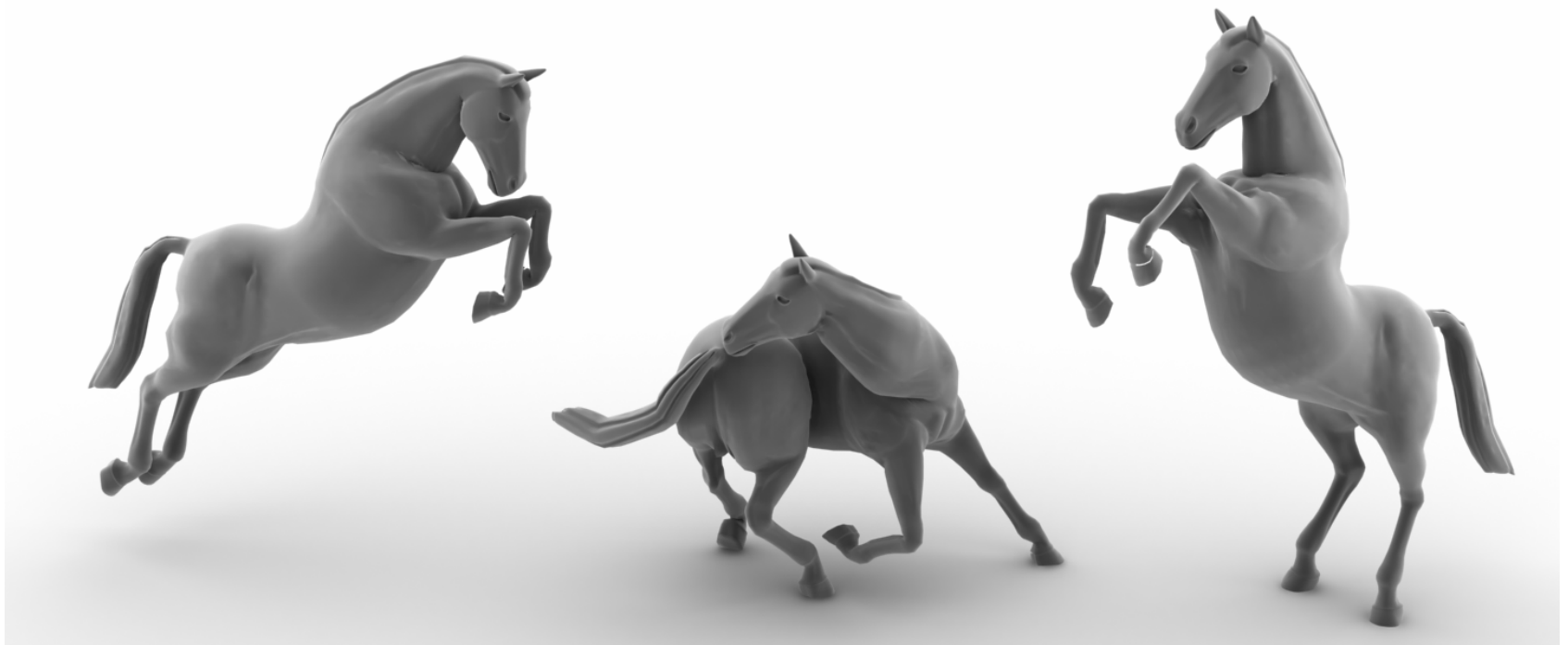


Results

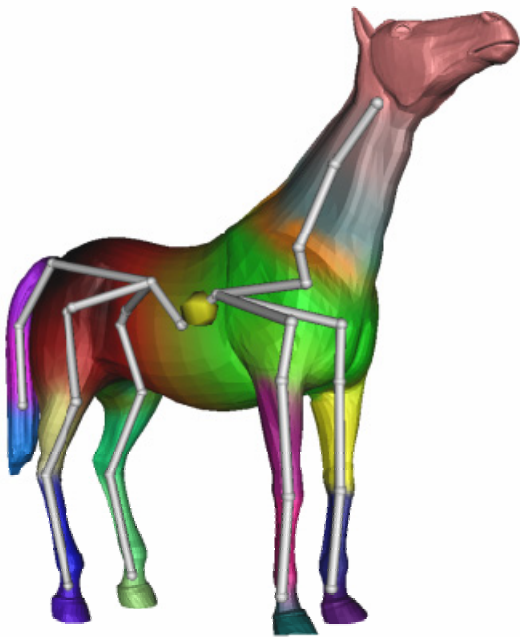
Examples



Results



Results



29 bones



19 bones



9 bones

Performance

Model	Faces	Example Poses	Bones	Face Clustering	Skinning	Skeleton Extraction
Hand	15789	46	19	9.96s	6.46s	0.00s
Horse	16843	23	29	5.53s	11.14s	0.00s
Cat	14410	9	24	2.11s	4.01s	0.00s
Armadillo	30000	9	12	5.21s	2.53s	0.00s
Elephant	84638	23	22	32.29s	32.23s	0.02s
Lion	9996	9	19	1.57s	1.85s	0.00s

Performance

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Face Clustering 10x-50x faster than Mean Shift Clustering [[James, Twigg 2005](#)]

Importing Skeletons

- Maya-script importer
- Manipulate directly in Maya
- No plugins/special software needed
- Works with existing production pipelines



Creating New Poses
(Manipulating with Maya)

Future Work

- Skeletons are good but not perfect
- Improve weight fitting
- Add user feedback to create an intelligent system

