

Morphing = Object Averaging



“an average” between two objects

Not an average of two *images of objects*...

...but an image of the *average object*!

Morphing = Object Averaging



How do we know what the average object looks like?

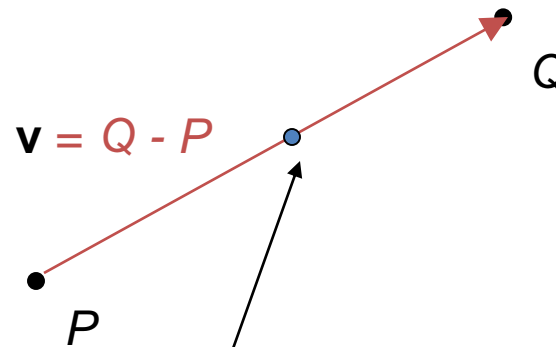
- We haven't a clue!
- But we can often fake something reasonable

Morphing = Warping + Cross Dissolving



Averaging Points

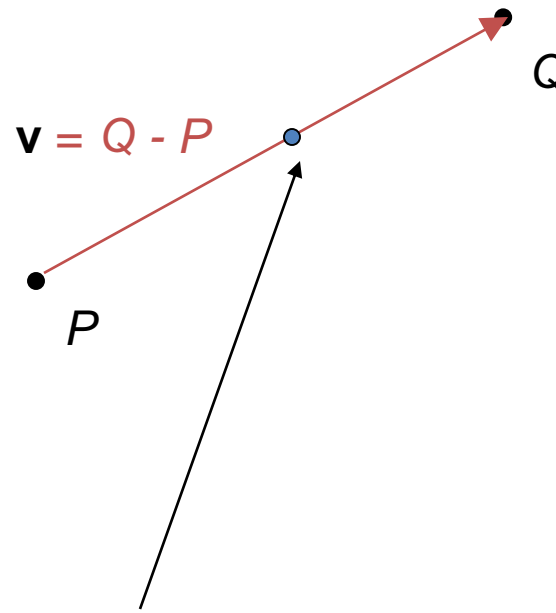
What's the average
of P and Q?



$$\begin{aligned} &P + 0.5v \\ &= P + 0.5(Q - P) \\ &= 0.5P + 0.5Q \end{aligned}$$

Averaging Points

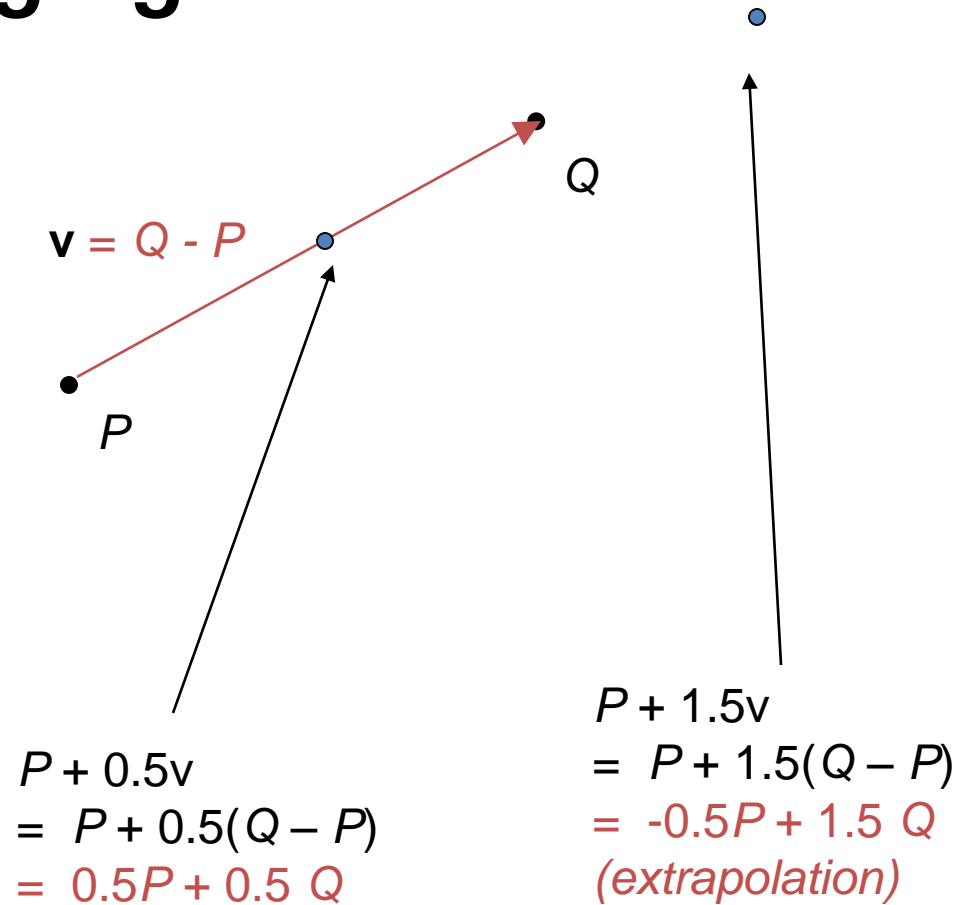
What's the average of P and Q?



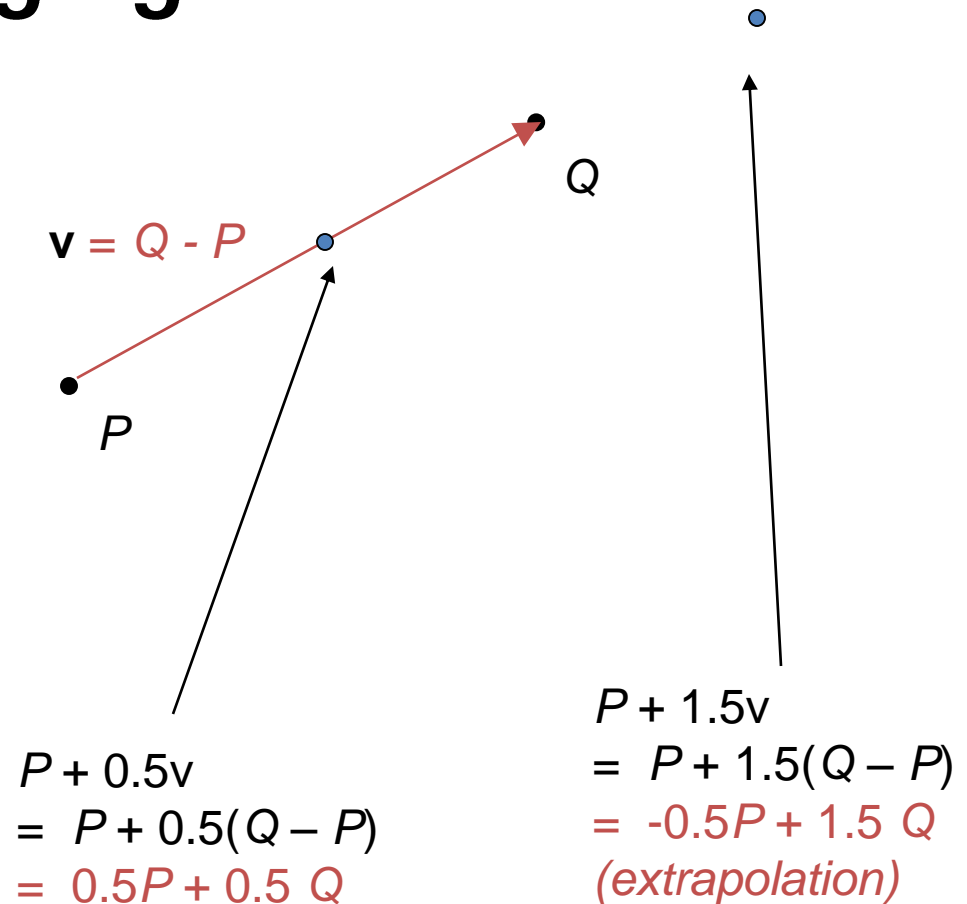
$$\begin{aligned} P + 0.5v \\ &= P + 0.5(Q - P) \\ &= 0.5P + 0.5Q \end{aligned}$$

Linear Interpolation
(Affine Combination):
New point $aP + bQ$,
defined only when $a+b = 1$
So $aP+bQ = aP+(1-a)Q$

Averaging Points



Averaging Points



- P and Q can be anything:
 - points on a plane (2D) or in space (3D)
 - Colors in RGB or HSV (3D)
 - Whole images (m-by-n D)... etc.

Averaging Images: Cross-Dissolve



Interpolate whole images:

$$\text{Image}_{\text{halfway}} = (1-t) * \text{Image}_1 + t * \text{image}_2$$

This is called **cross-dissolve** in film industry

Averaging Images: Cross-Dissolve



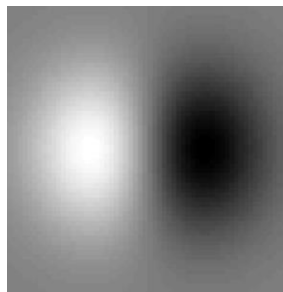
Interpolate whole images:

$$\text{Image}_{\text{halfway}} = (1-t) * \text{Image}_1 + t * \text{image}_2$$

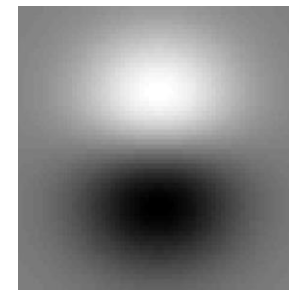
This is called **cross-dissolve** in film industry

Averaging Images

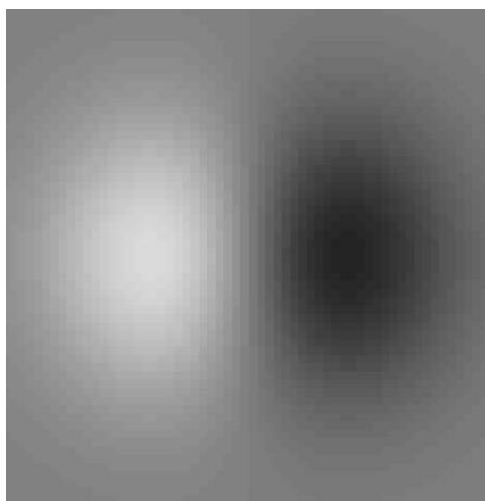
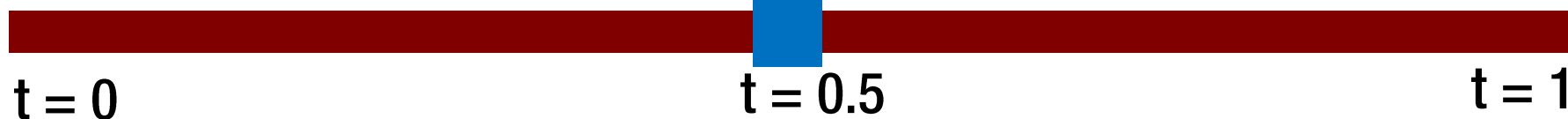
Averaging Images = Rotating Objects



Image₁

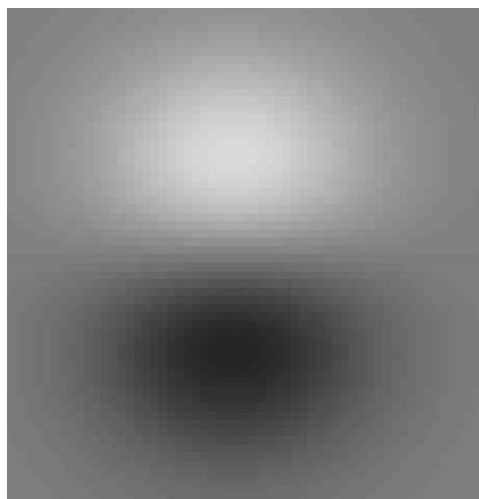


Image₂



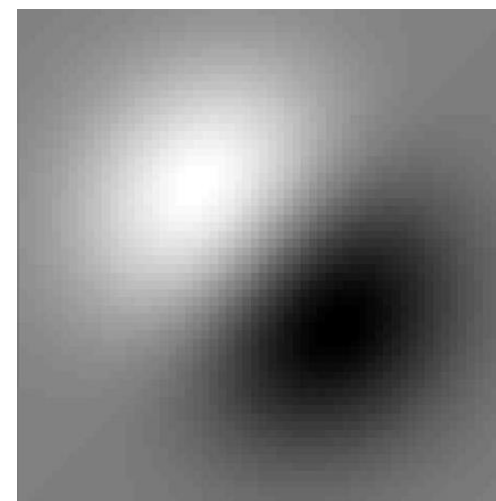
$(1-t) \cdot \text{Image}_1$

+



$t \cdot \text{Image}_2$

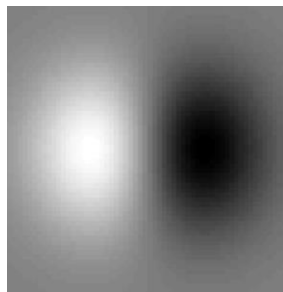
=



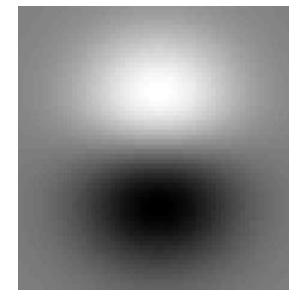
Image_{halfway}

Averaging Images

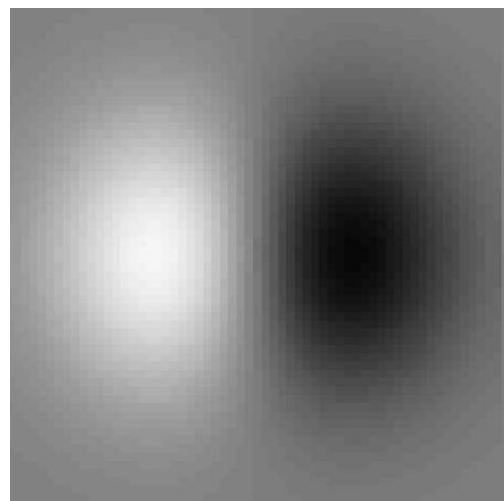
Averaging Images = Rotating Objects



Image₁

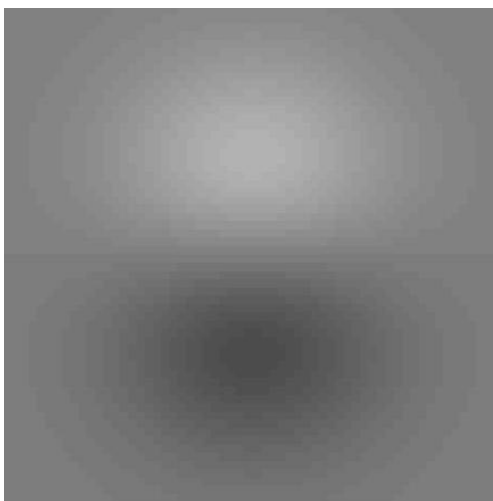


Image₂



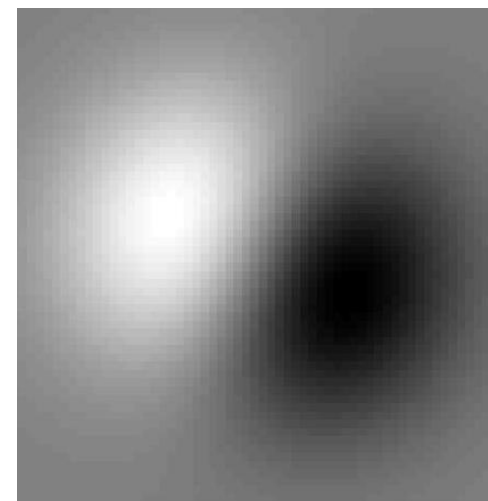
$(1-t) \cdot \text{Image}_1$

+



$t \cdot \text{Image}_2$

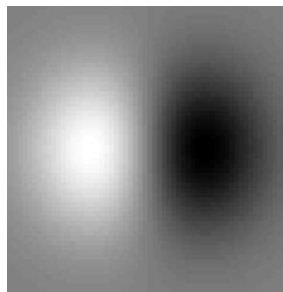
=



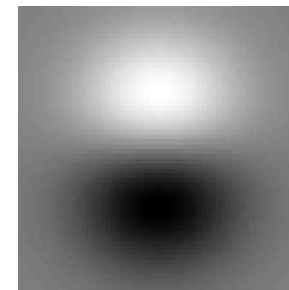
Image_{halfway}

Averaging Images

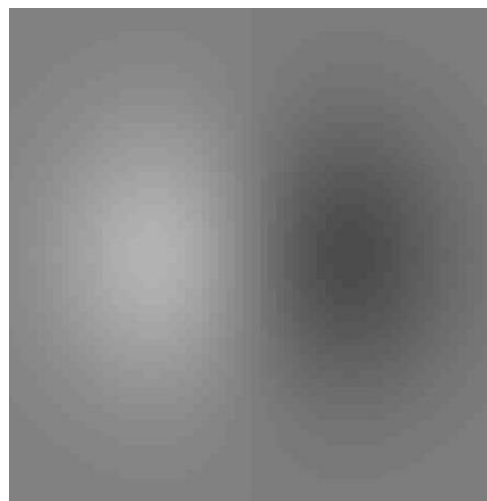
Averaging Images = Rotating Objects



Image₁

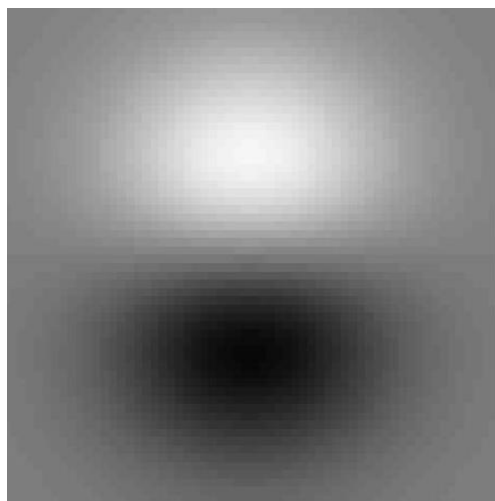


Image₂



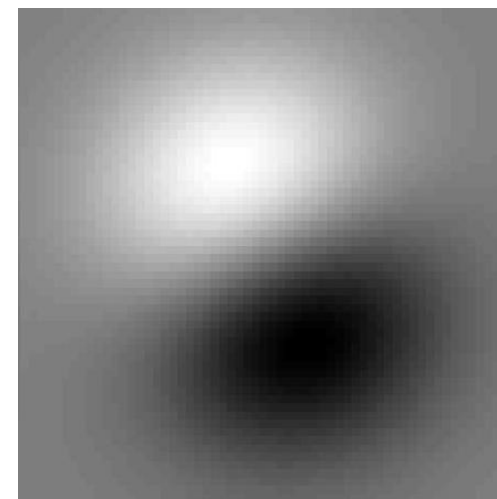
$(1-t) \cdot \text{Image}_1$

+



$t \cdot \text{Image}_2$

=



Image_{halfway}

Averaging Images

Image₁

Image₂



+



=

?

Averaging Images

Image₁

Image₂



+



?

=



Averaging Images

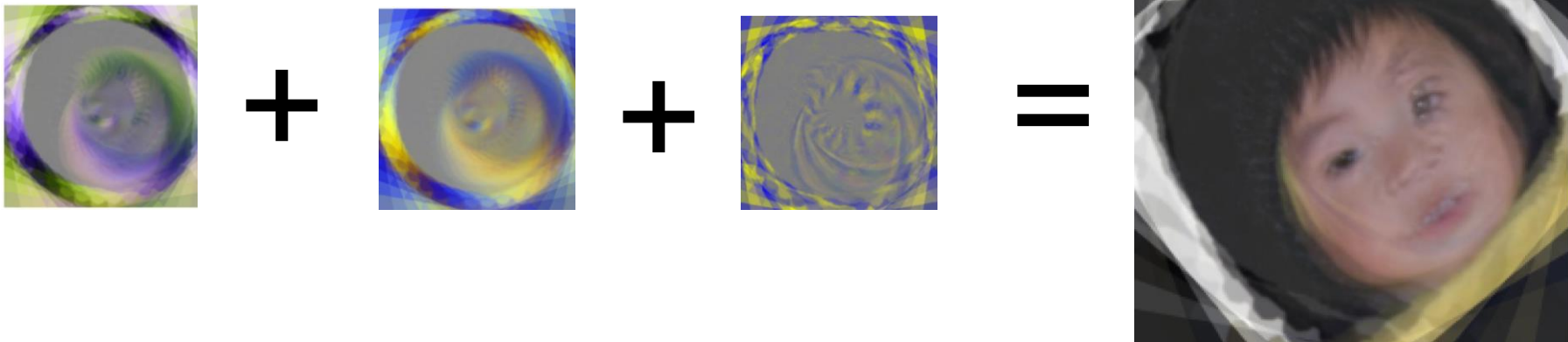
Image₁

Image₂



Averaging Images \neq Rotating Complex Objects

Averaging Images



Averaging **'Eigen'** Images = Rotating Objects

Cat-Baby Averaging



Object Averaging with feature matching!

Nose to nose, eye to eye, mouth to mouth, etc.

This is a non-parametric **warp**

Cat-Baby Averaging



Object Averaging with feature matching (warping)!

- Nose to nose, eye to eye, mouth to mouth, etc.
- This is a non-parametric warp

Warping, then cross-dissolve



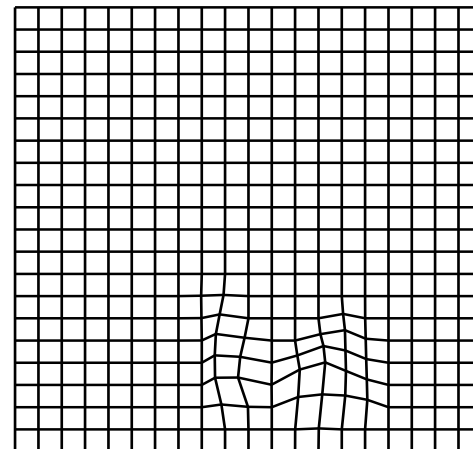
Morphing procedure:

1. Find the average shape
2. Non-parametric warping
3. Find the average color
 - Cross-dissolve the warped images

Image warping – non-parametric



Warp Grid



Warp Object

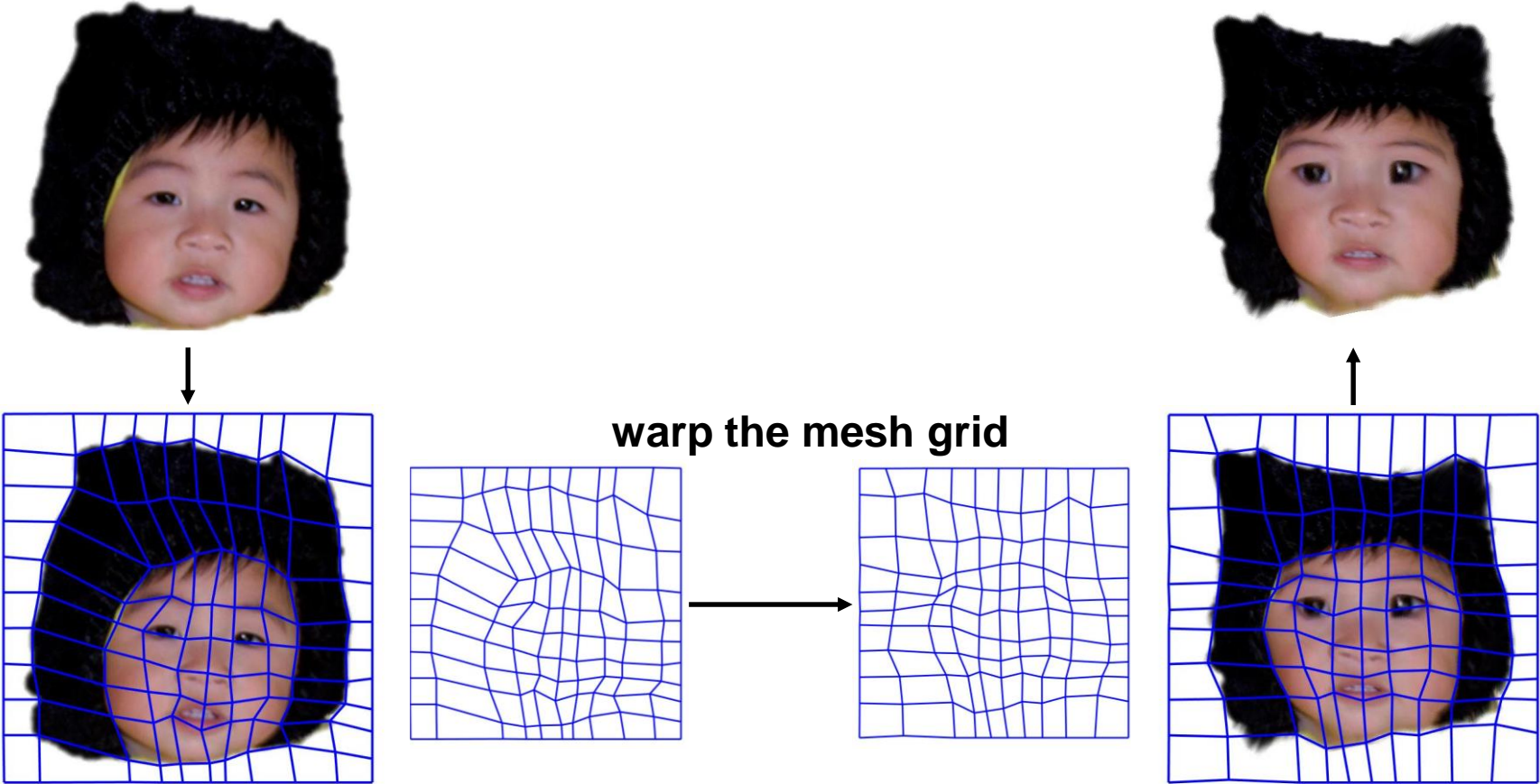
Image warping idea 1: dense flow



Displacement vector (u, v) for each pixel.

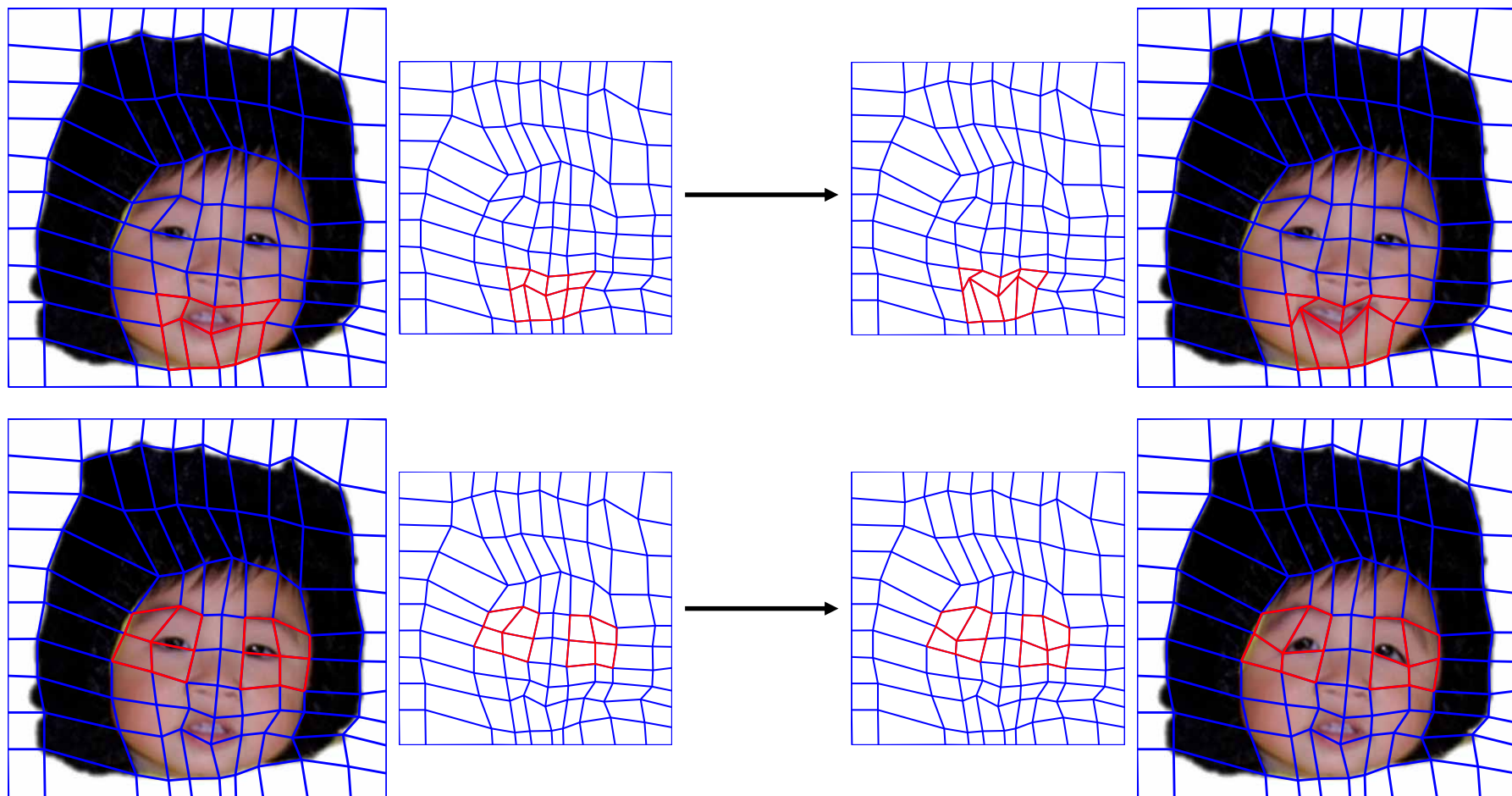
Great details... but too much work, let's simplify it to mesh grid

Image warping idea 2 : dense grid



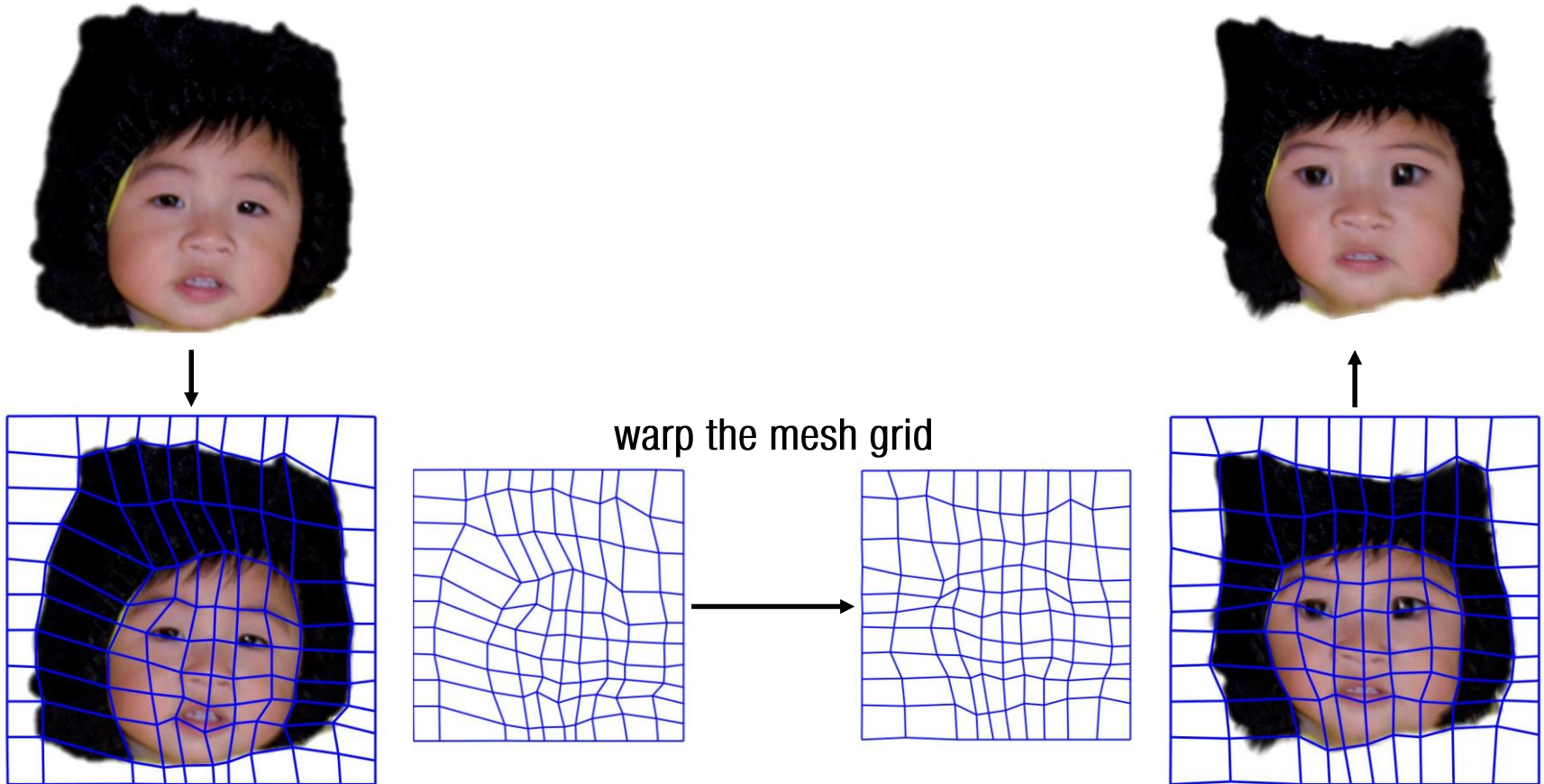
Define and manipulate the mesh grid

Image warping idea 2 : dense grid



Grid deformation generates expression change

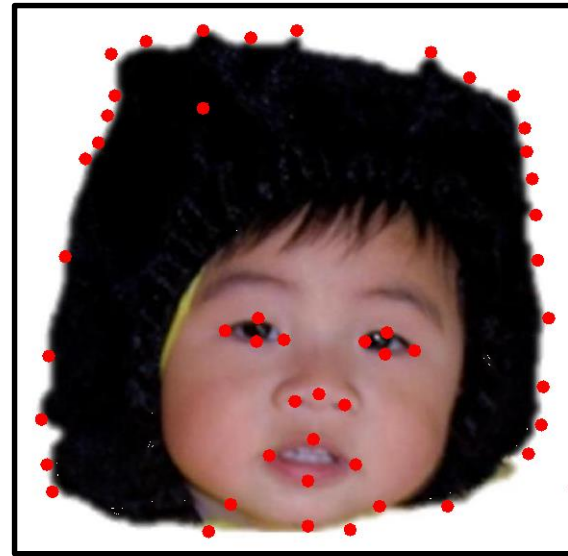
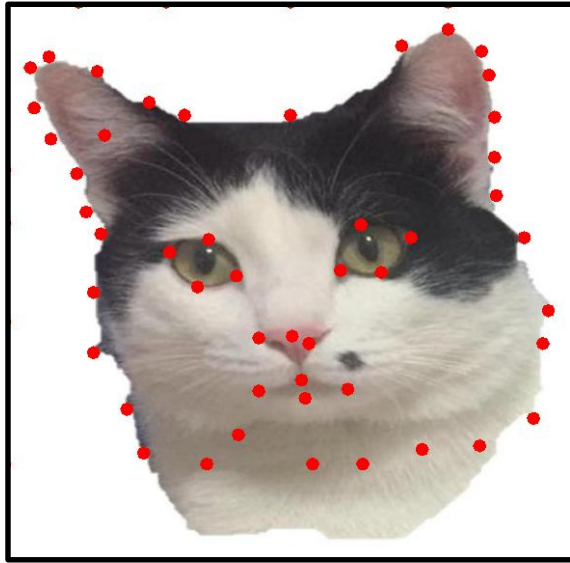
Image warping idea 2 : dense grid



Still too much work...

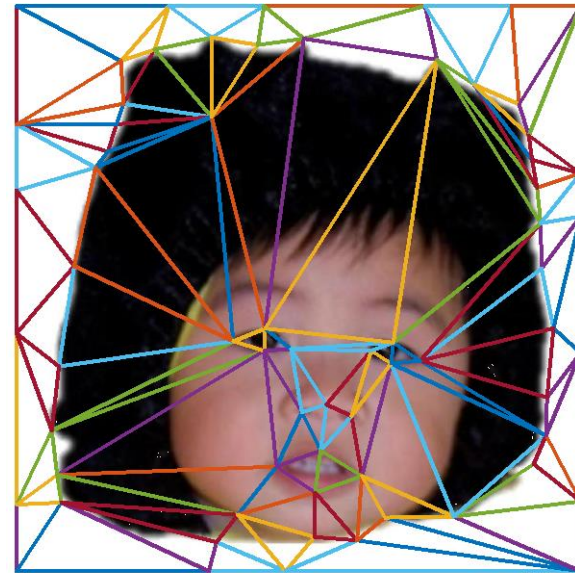
simplify it to sparse control points and triangles

Image warping idea 3 : sparse points



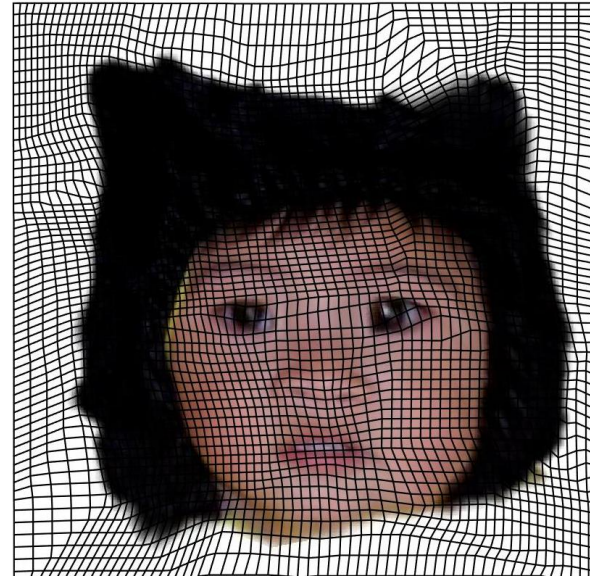
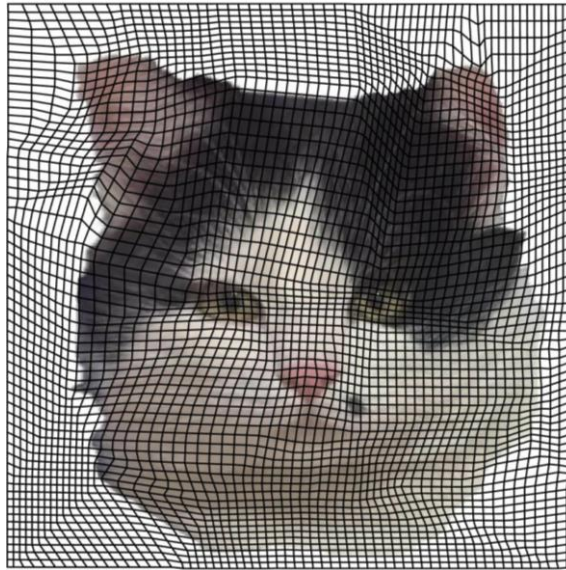
Specify sparse points and their correspondence

Image warping idea 3 : sparse points



- Define a triangular mesh over the feature points
- Triangle-to-triangle correspondences
- Warp each triangle separately from source to destination

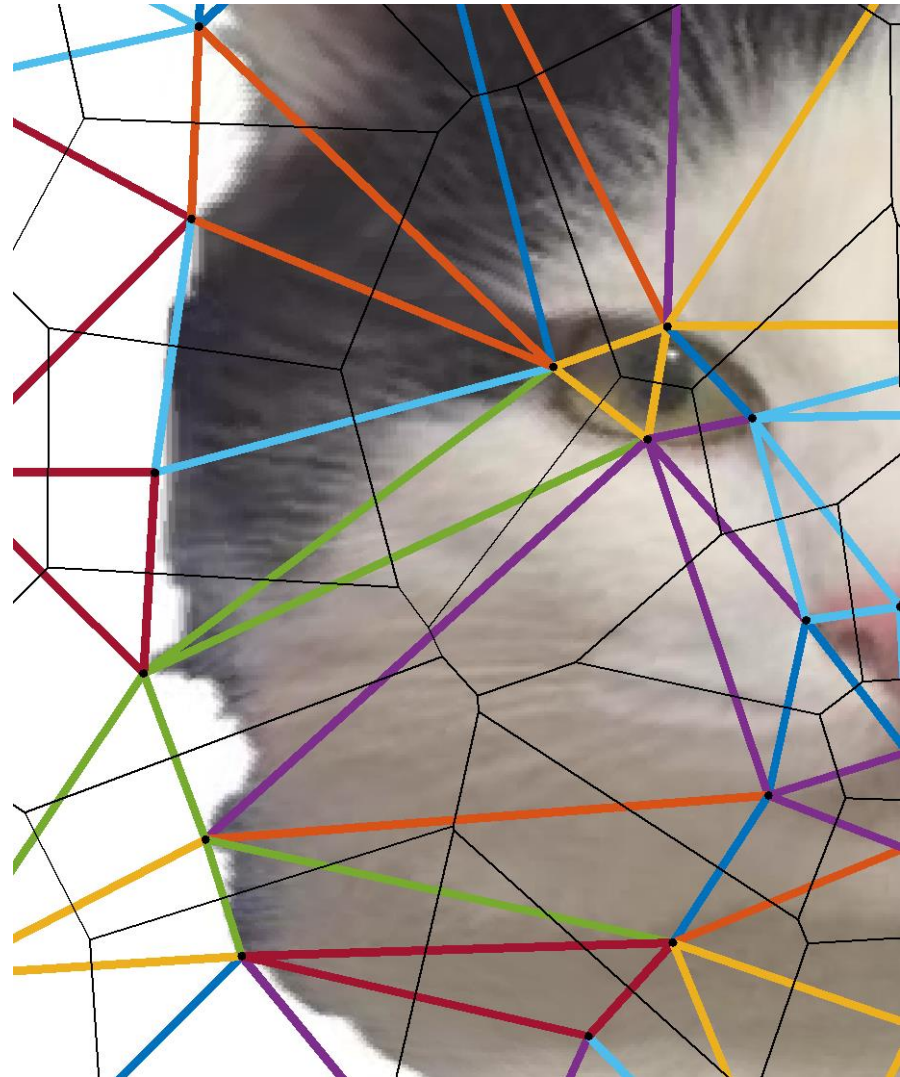
From sparse points to dense grid



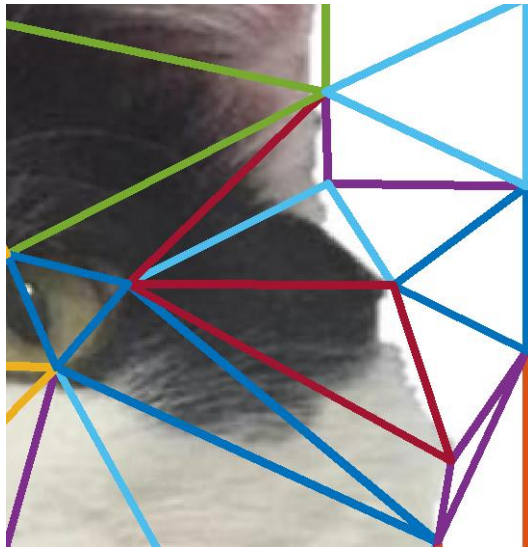
- Warping on triangulation corresponds to warping on dense grid, and dense pixel flow

Delaunay Triangulation

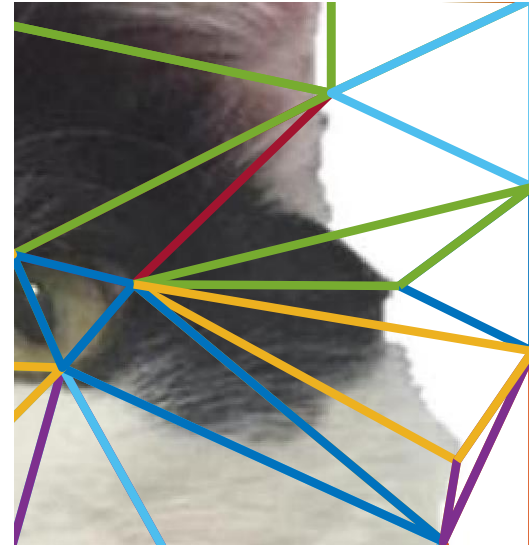
- Draw the dual to the Voronoi diagram by connecting each two neighboring sites in the Voronoi diagram.
- The DT may be constructed in $O(n \log n)$ time.
- This is what Matlab's delaunay function uses.



What is good feature points



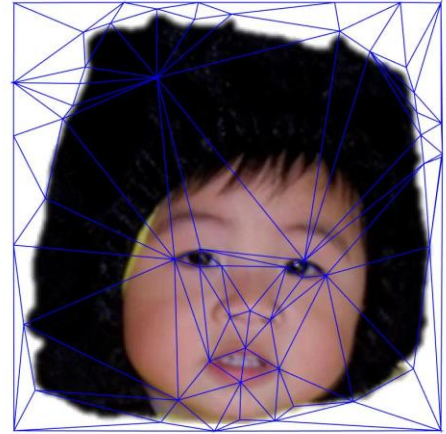
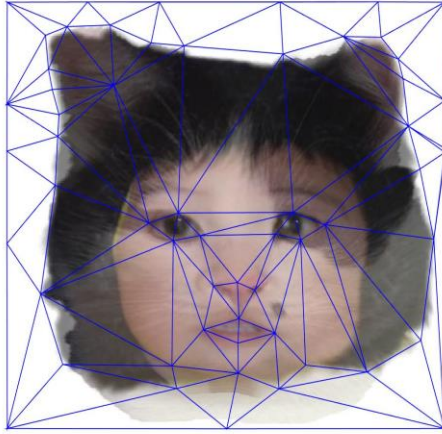
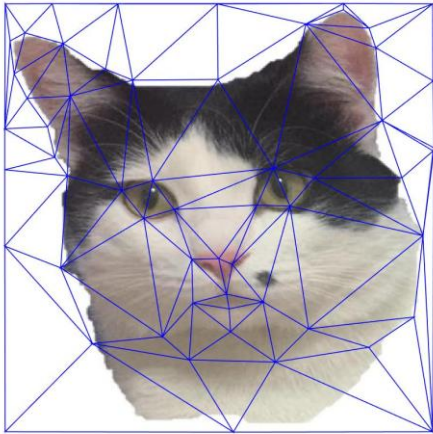
Good



Bad

- The triangulation is consistent with image boundary
 - Texture regions won't fade into the background when morphing
- Maintain the relationship between parts

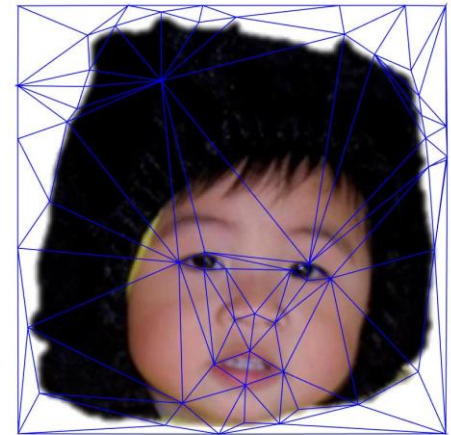
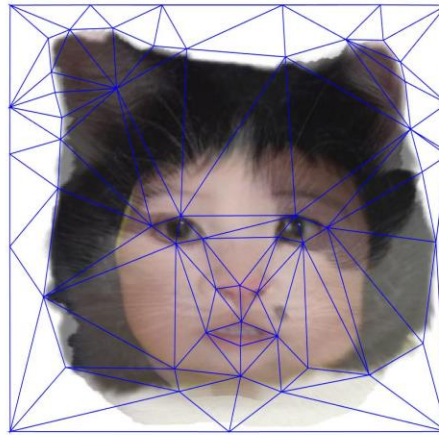
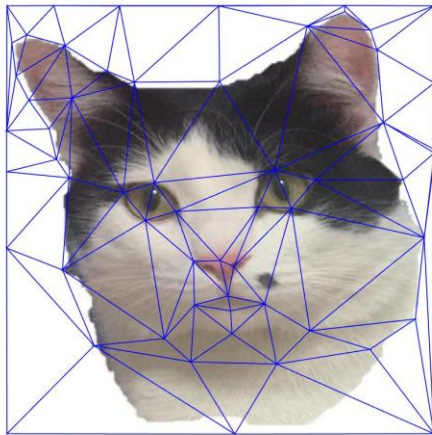
Triangular Mesh



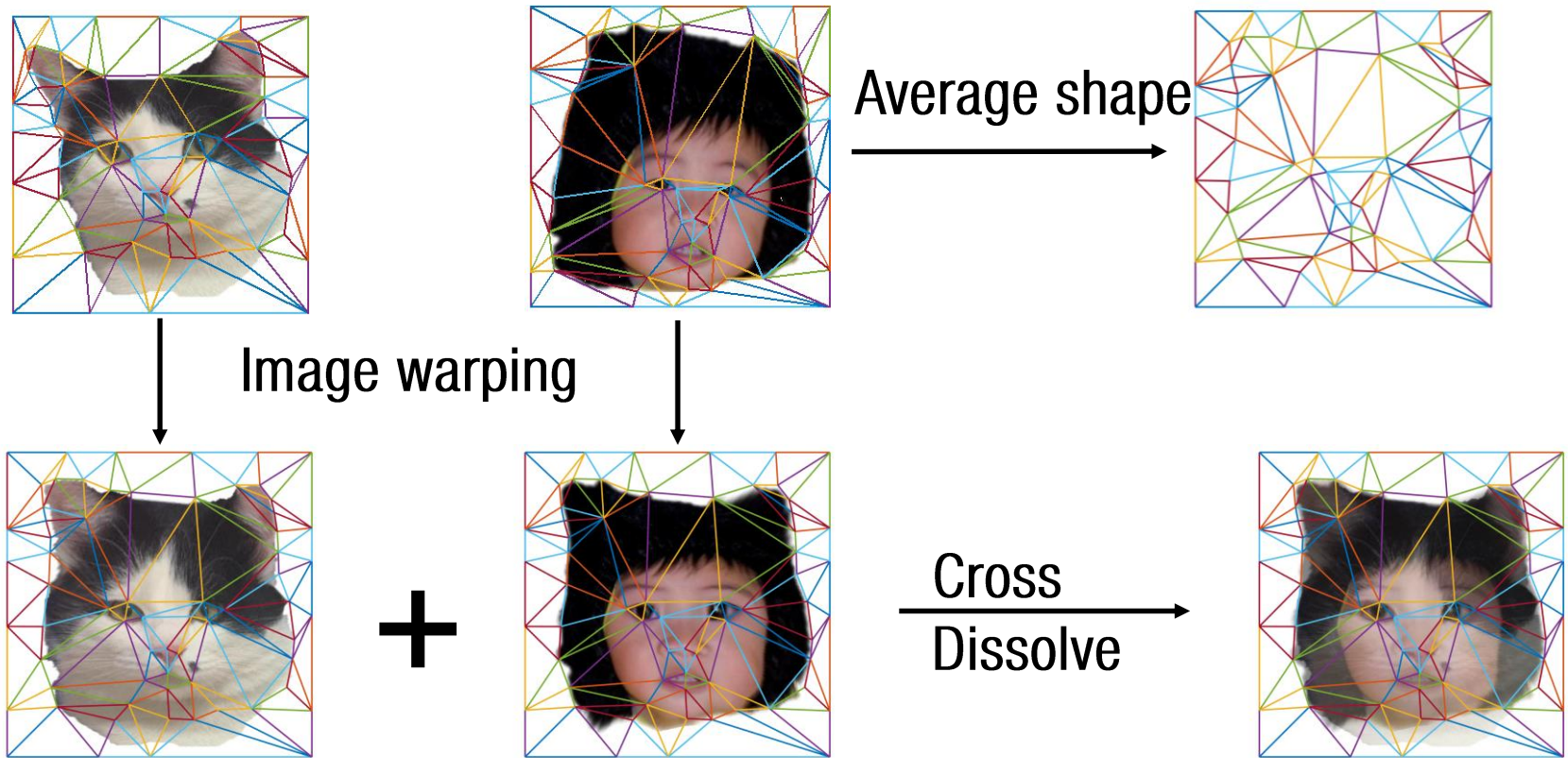
1. Input correspondences at key feature points
2. Define a triangular mesh over the points
 - Same mesh in both images!
 - Now we have triangle-to-triangle correspondences

Warp interpolation

- How do we create an intermediate warp at time t ?
 - Assume $t = [0, 1]$
 - Simple linear interpolation of each feature pair
 - $(1-t)*p1 + t*p0$ for corresponding features $p0$ and $p1$



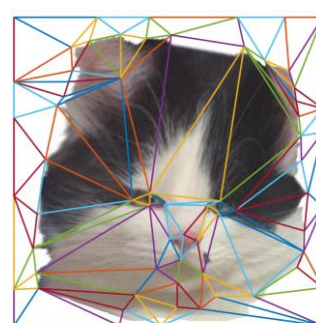
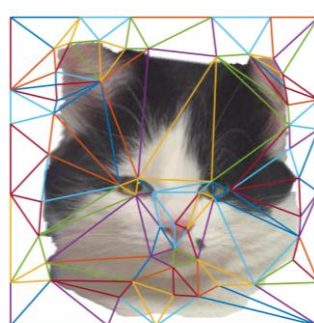
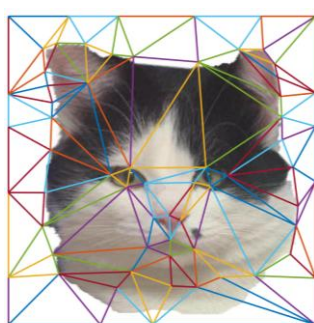
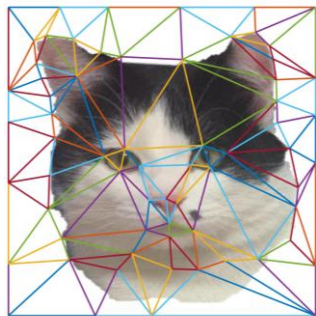
Morphing = Warping + Cross-dissolve



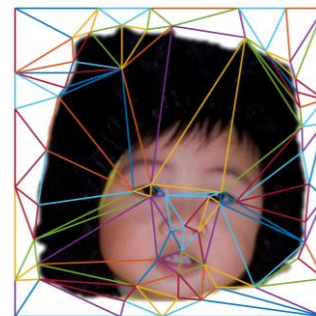
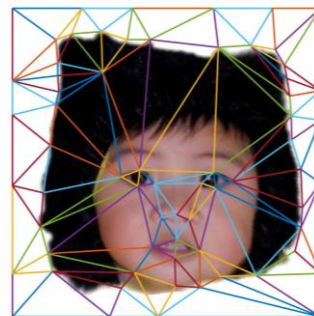
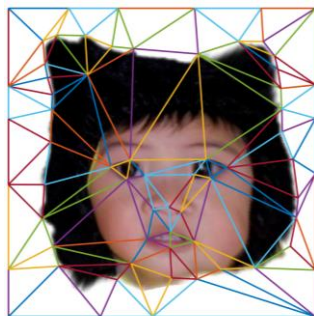
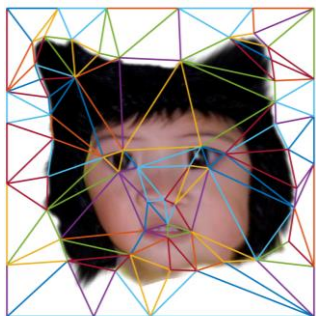
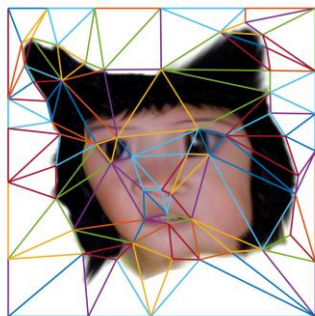
- For each time t , define the intermediate shape
 - $p_t = (1 - t) \times p_1 + t \times p_2$
 - triangulation doesn't change
- Warp both image to the intermediate shape
- Dissolve image = $(1-t) \times \text{image}_1 + t \times \text{Image}_2$

Morphing Sequence

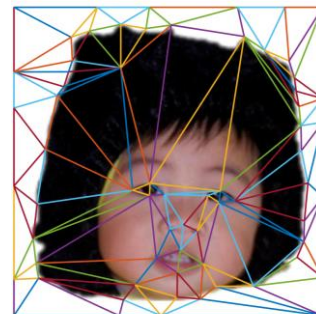
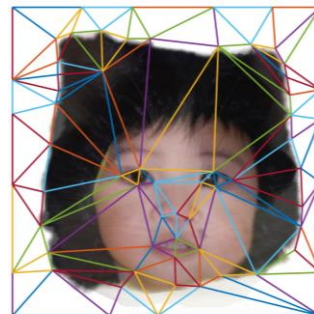
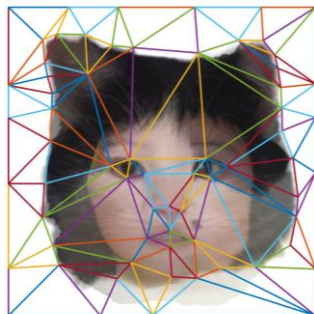
warped
image 1



warped
image 2



morph
result



t=0

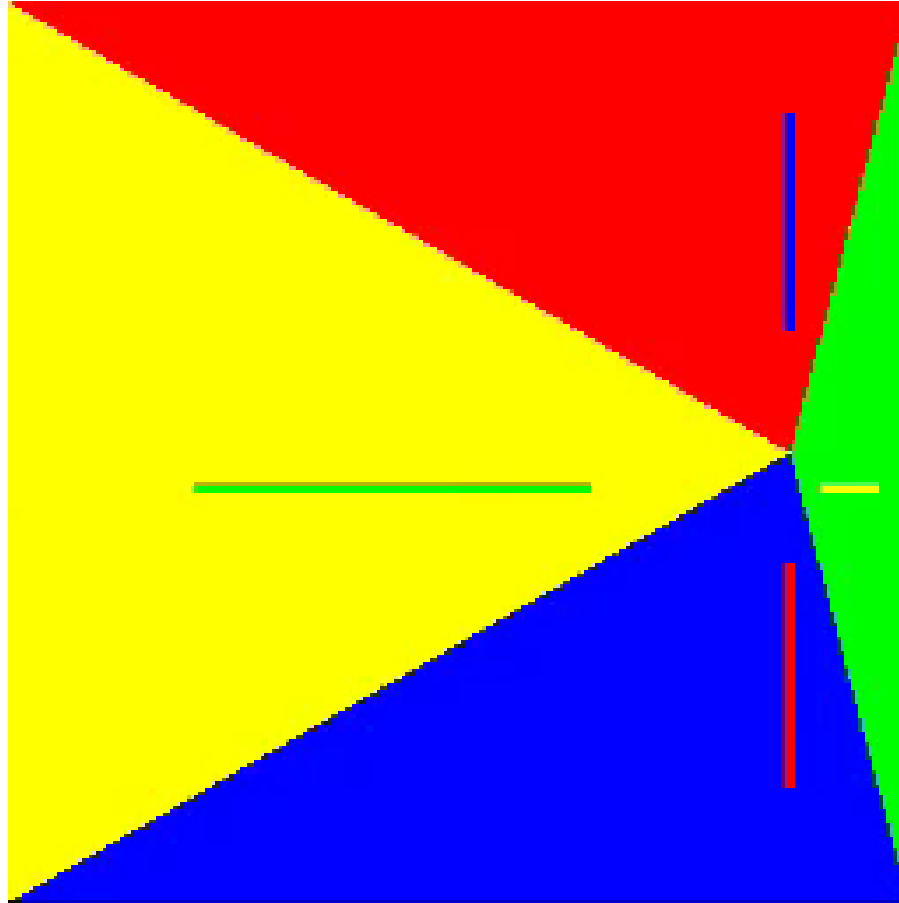
t=0.3

t=0.5

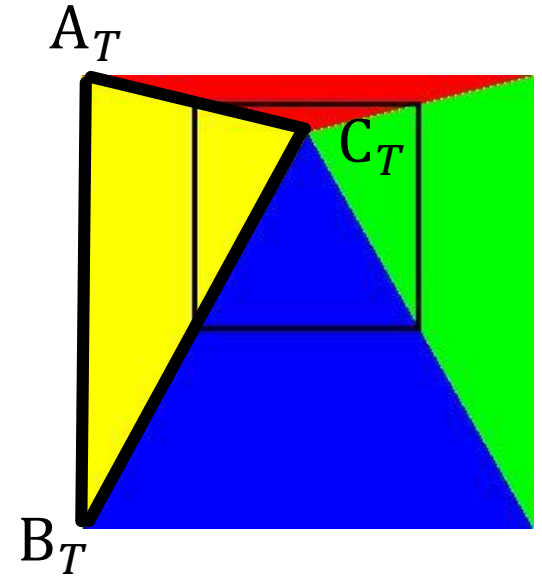
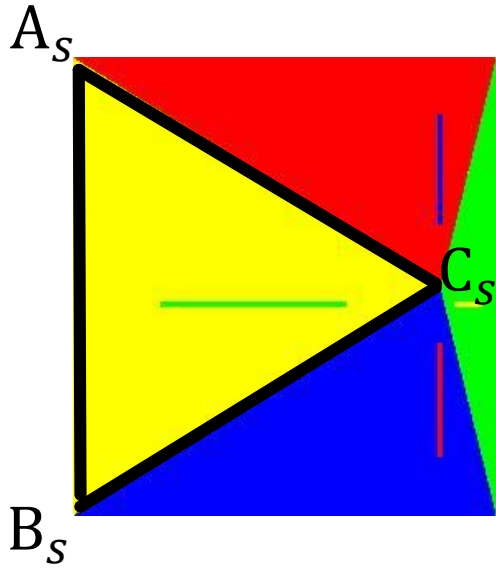
t=0.7

t=1

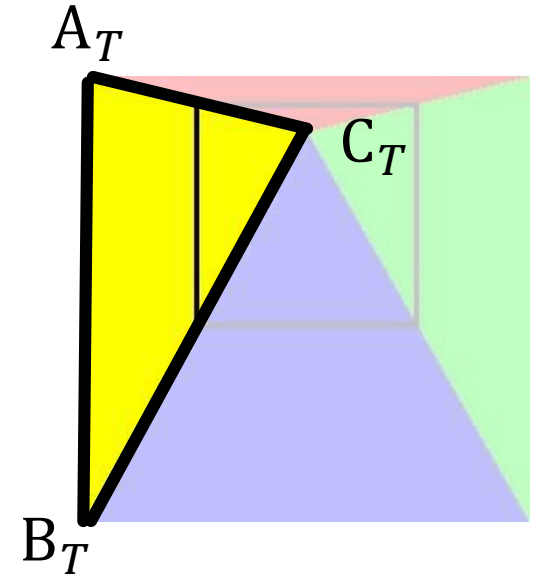
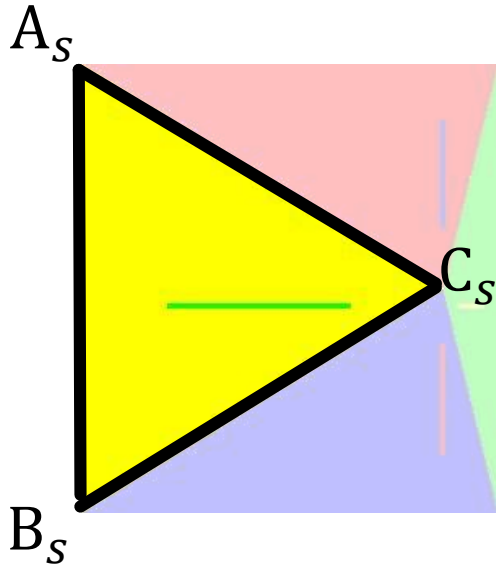
An Example



Morphing



Step 1: Triangle interpolation



$t = 0$

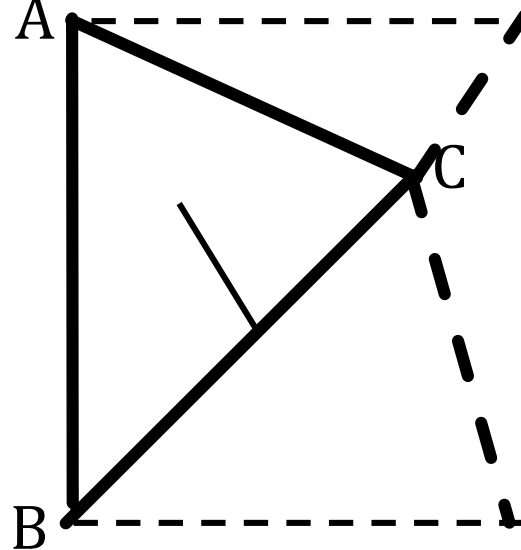
$t = 0.3$

$t = 1$

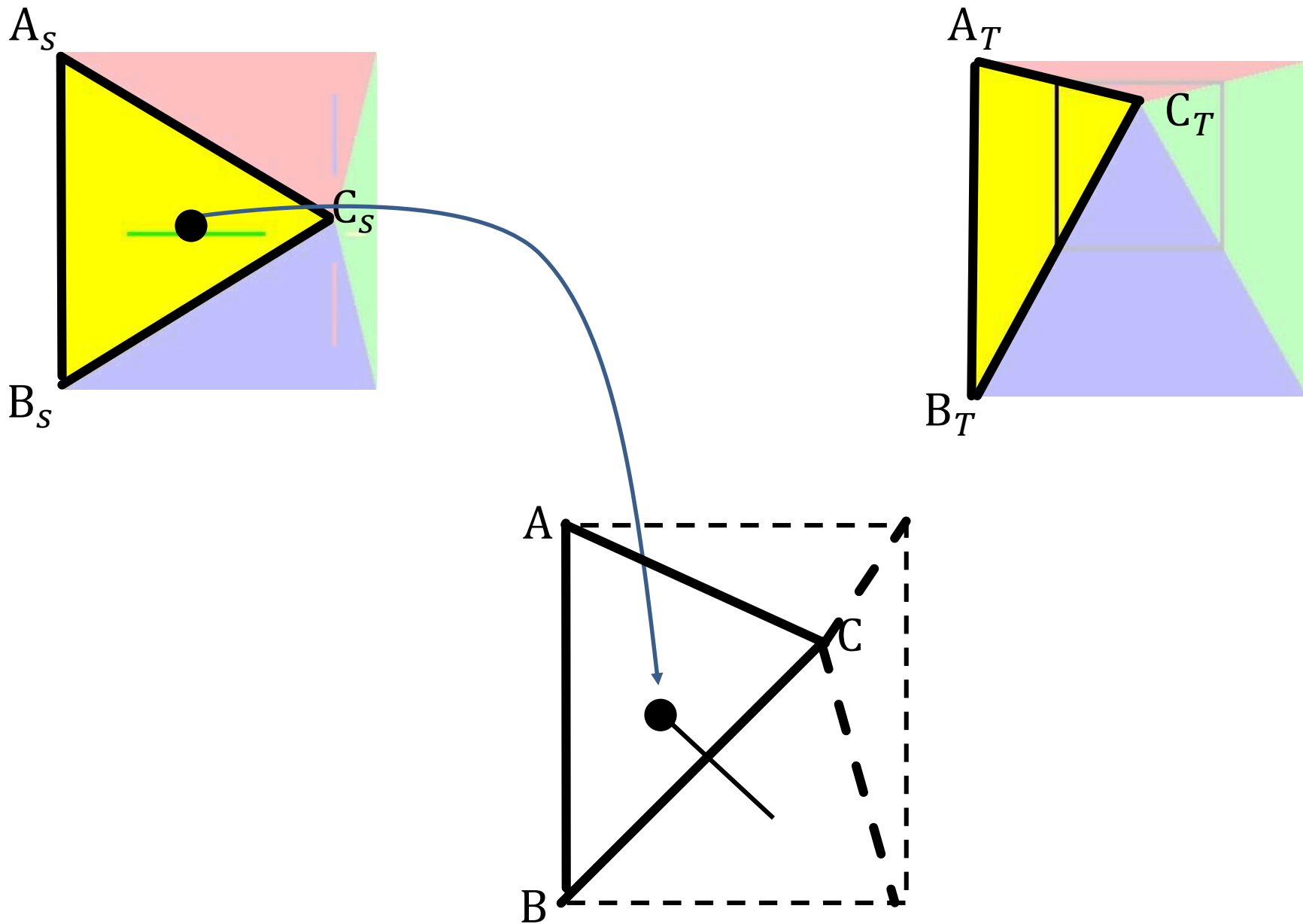
$$\mathbf{A}_t = (1-t)\mathbf{A}_S + t\mathbf{A}_T$$

$$\mathbf{B}_t = (1-t)\mathbf{B}_S + t\mathbf{B}_T$$

$$\mathbf{C}_t = (1-t)\mathbf{C}_S + t\mathbf{C}_T$$



Step 2: Warping



Step 2: Warping

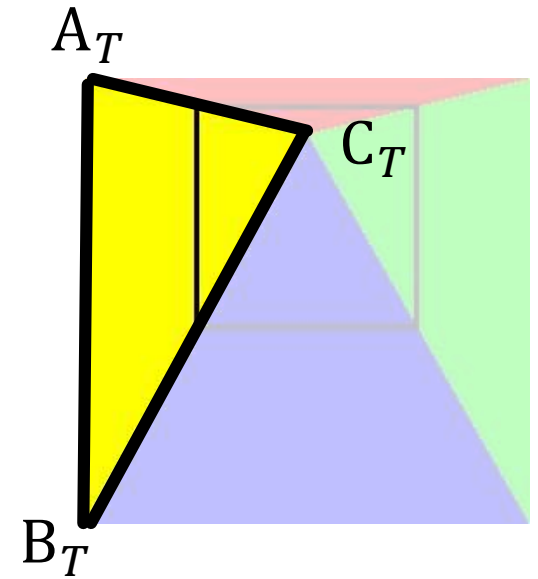
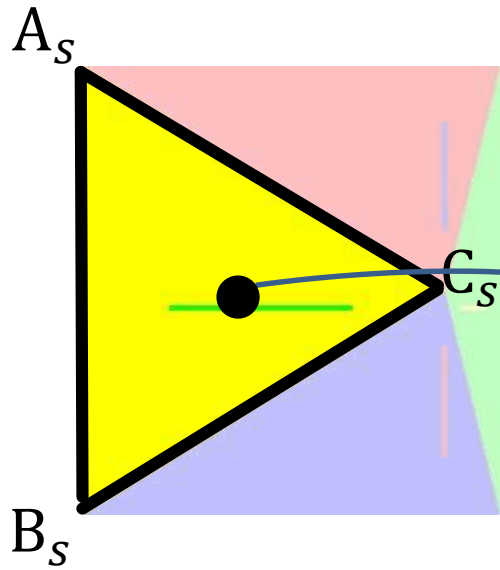
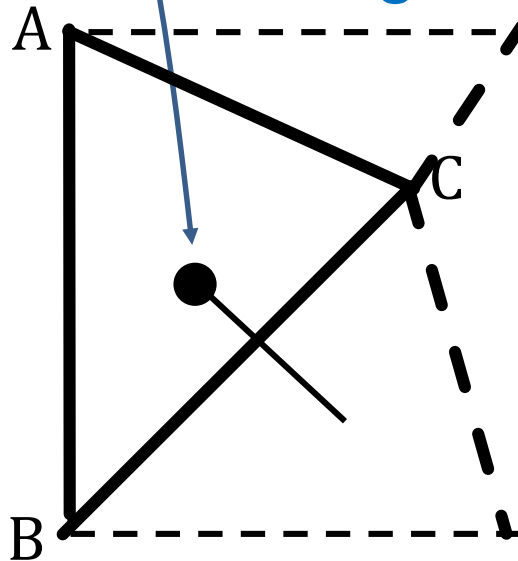
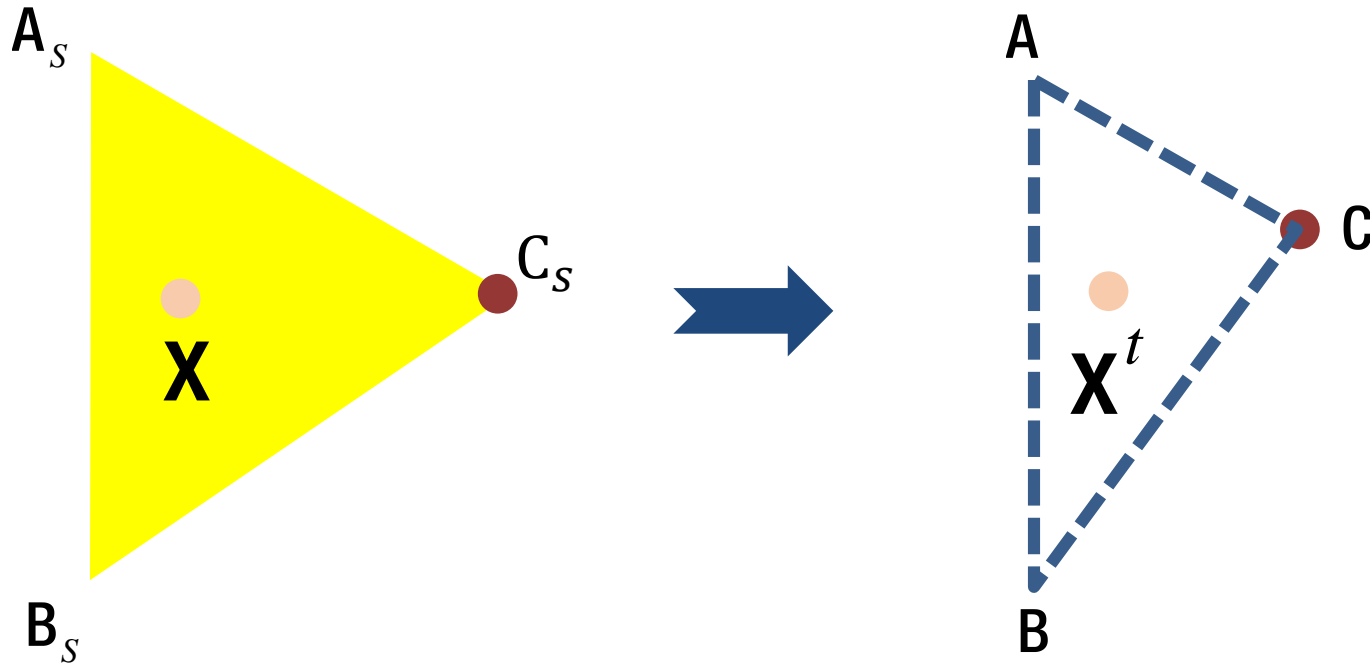


Image warping: from source triangle to the mean triangle

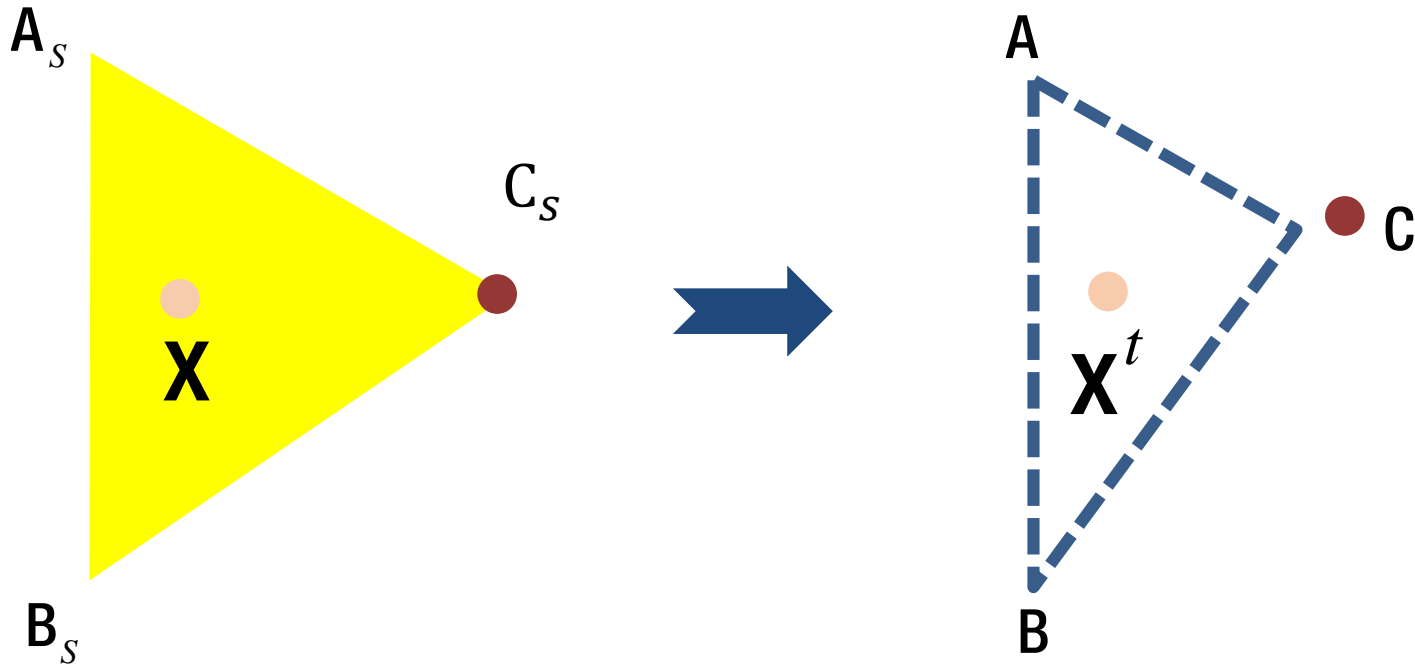


Triangle warping = Affine transform



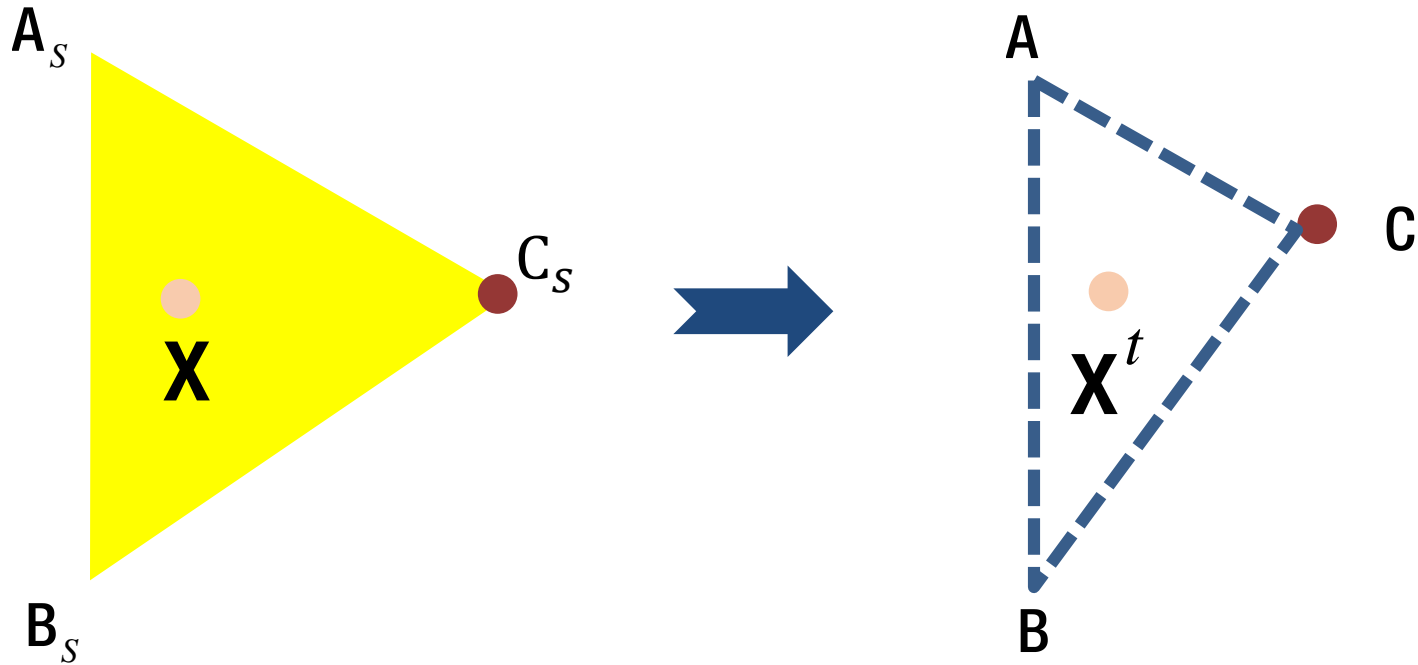
Affine transform is a pixel transportation $X \rightarrow X^t$
It is controlled by the movement of the three vertices of the triangle

Barycentric Coordinates



Each point X has an invariant representation with respect to the three vertices.

Barycentric Coordinates

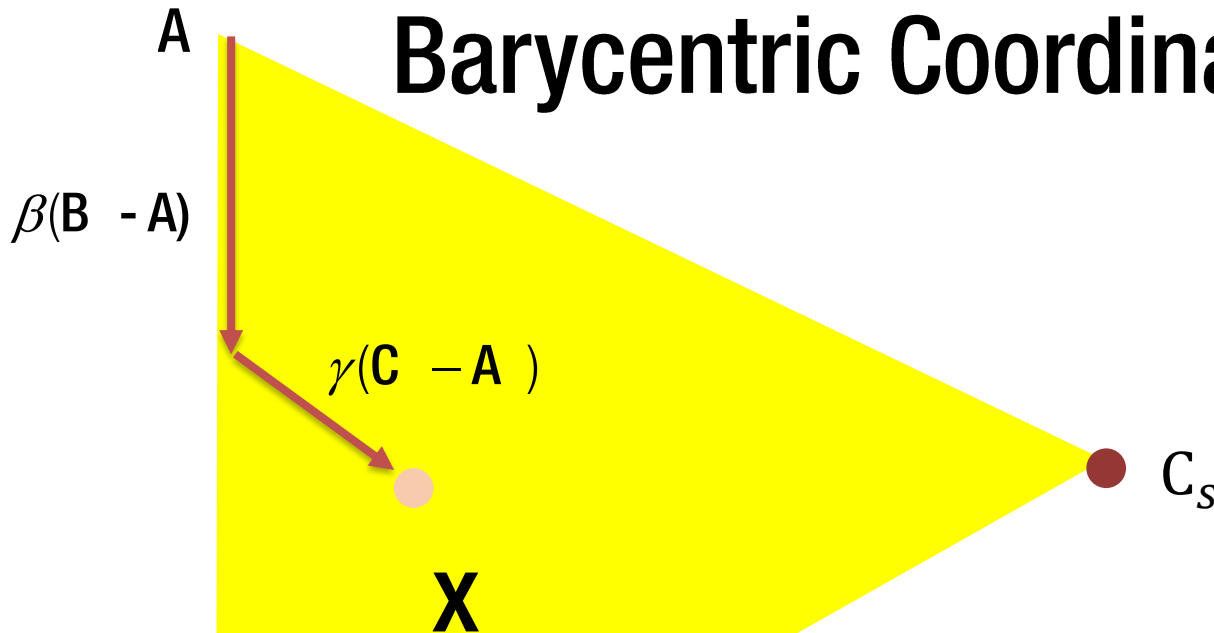


$$\mathbf{x} = \alpha \mathbf{A}_S + \beta \mathbf{B}_S + \gamma \mathbf{C}_S$$

$$\alpha + \beta + \gamma = 1$$

$$\mathbf{x}^t = \alpha \mathbf{A}_t + \beta \mathbf{B}_t + \gamma \mathbf{C}_t$$

Barycentric Coordinates



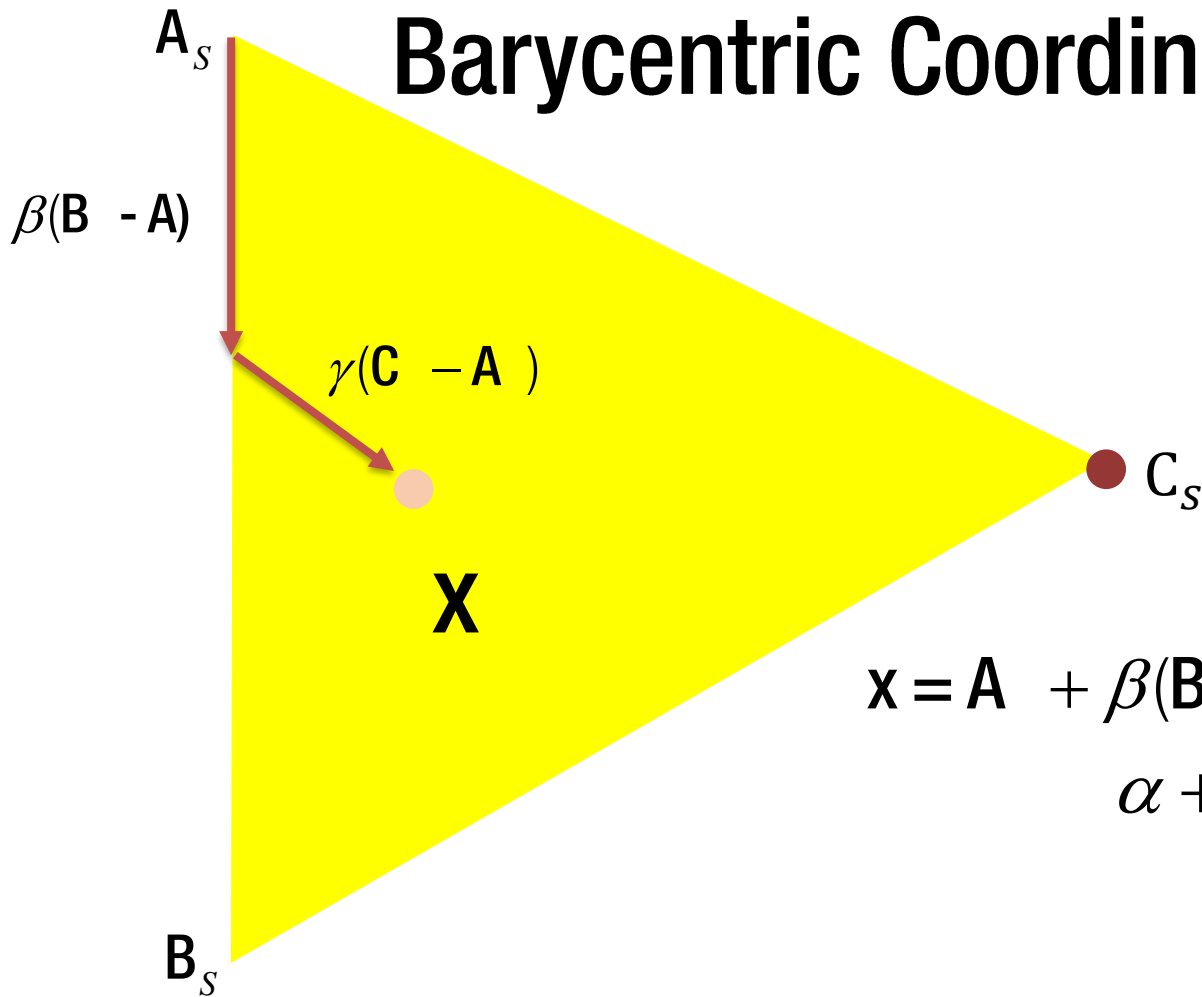
$$\mathbf{x} = \mathbf{A} + \beta(\mathbf{B} - \mathbf{A}) + \gamma(\mathbf{C} - \mathbf{A})$$

$$\mathbf{x} = (1 - \beta - \gamma)\mathbf{A} + \beta\mathbf{B} + \gamma\mathbf{C}$$



$$\mathbf{x} = \alpha\mathbf{A} + \beta\mathbf{B} + \gamma\mathbf{C} \quad \alpha + \beta + \gamma = 1$$

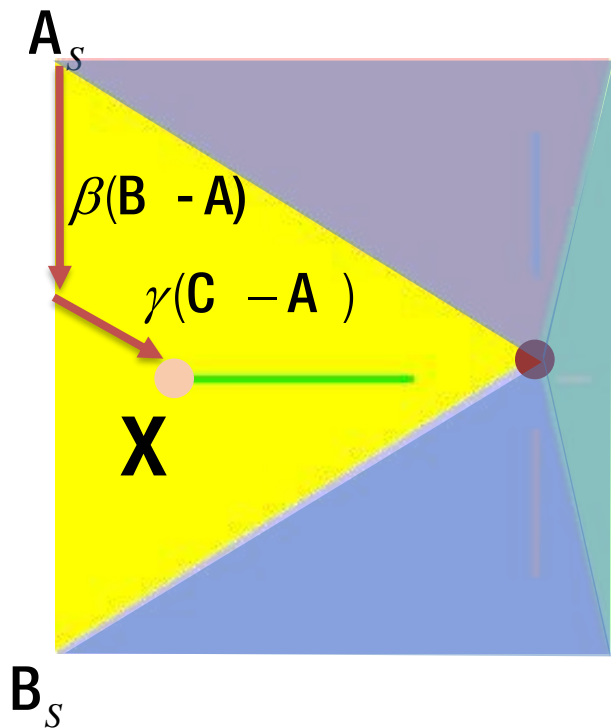
Barycentric Coordinates



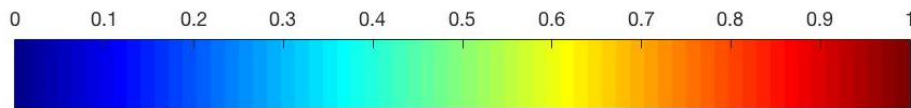
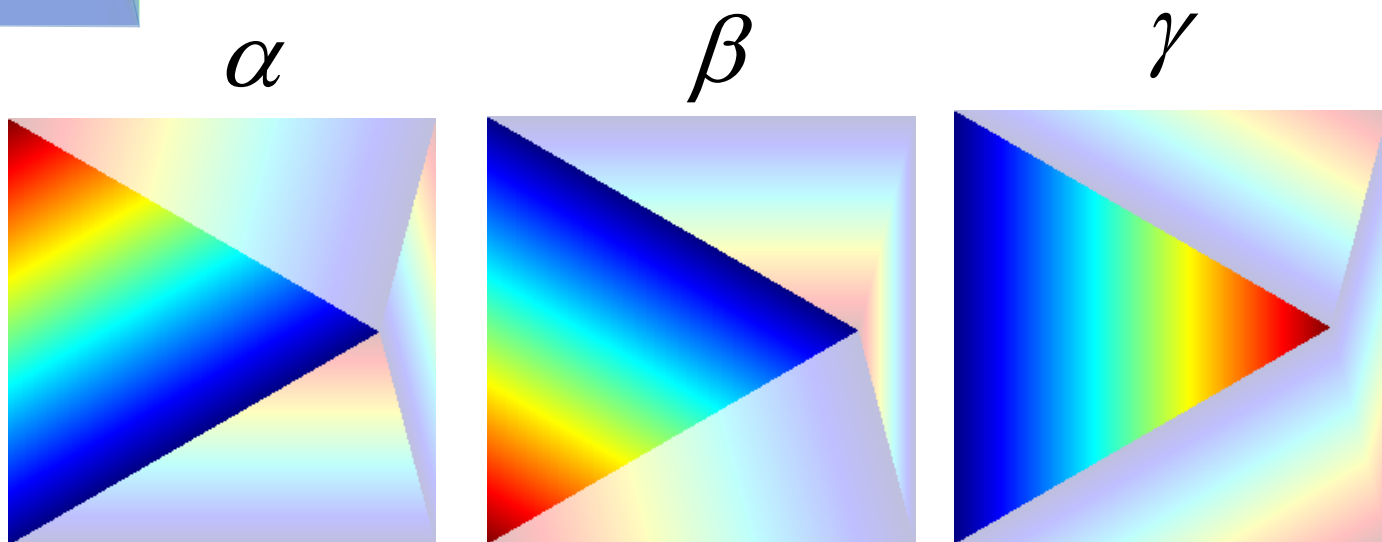
$$\mathbf{x} = \mathbf{A} + \beta(\mathbf{B} - \mathbf{A}) + \gamma(\mathbf{C} - \mathbf{A})$$
$$\alpha + \beta + \gamma = 1$$

$$\begin{bmatrix} \mathbf{A}_x & \mathbf{B}_x & \mathbf{C}_x \\ \mathbf{A}_y & \mathbf{B}_y & \mathbf{C}_y \\ 1 & 1 & 1 \end{bmatrix} \begin{bmatrix} \alpha \\ \beta \\ \lambda \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} \quad \text{linear equations in 3 unknowns}$$

Barycentric coordinate



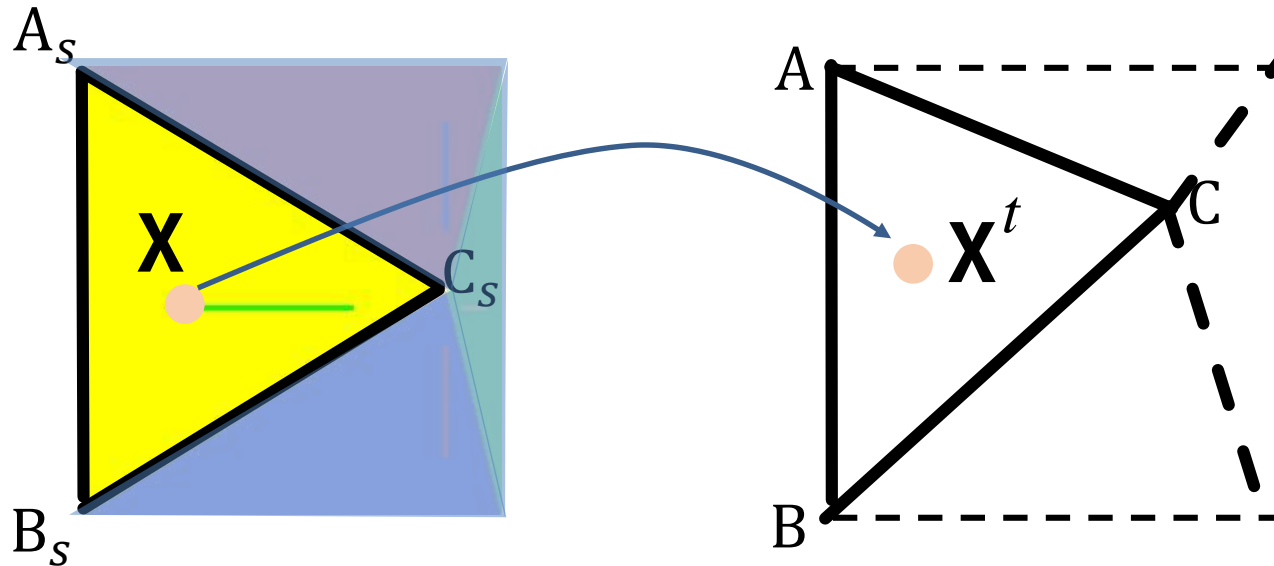
$$\begin{bmatrix} A_x & B_x & C_x \\ A_y & B_y & C_y \\ 1 & 1 & 1 \end{bmatrix} \begin{bmatrix} \alpha \\ \beta \\ \lambda \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$



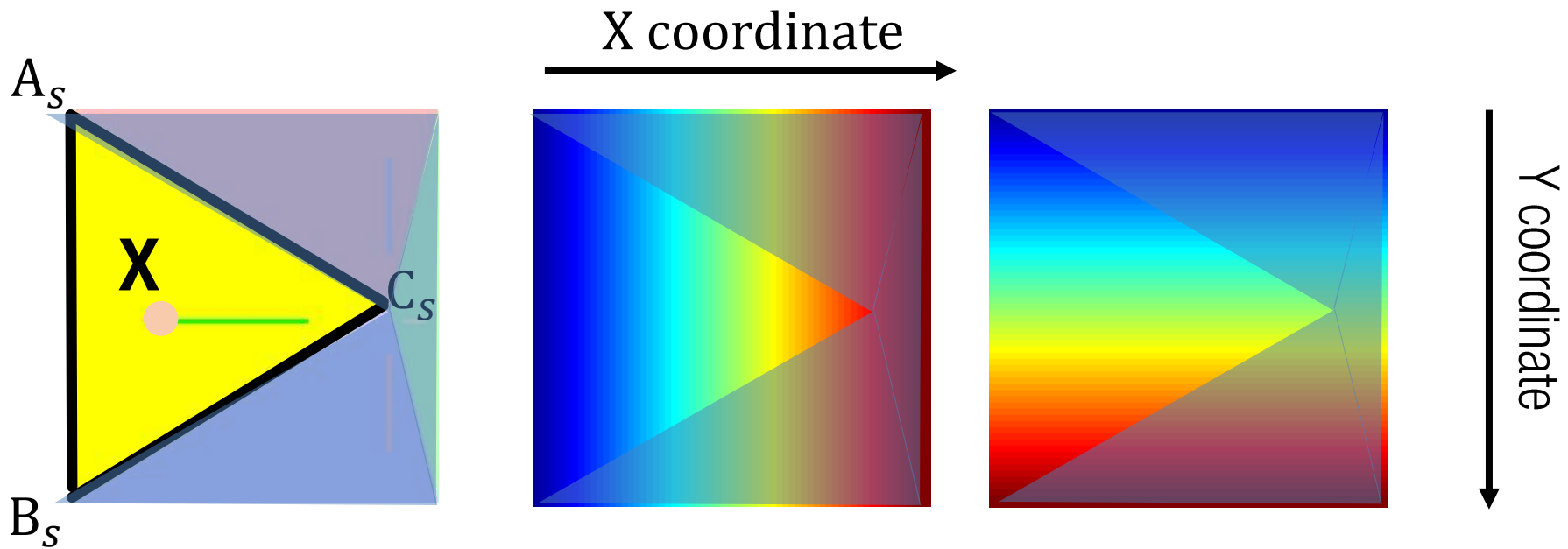
Warping with Barycentric Coordinate

$$\mathbf{X} = \alpha \mathbf{A}_S + \beta \mathbf{B}_S + \gamma \mathbf{C}_S$$

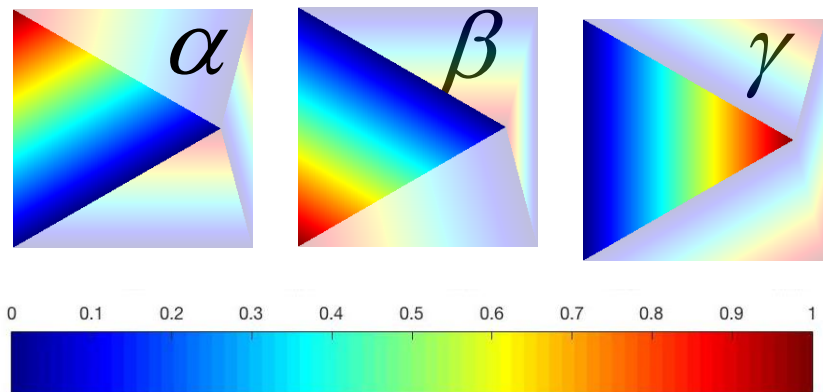
$$\mathbf{X}^t = \alpha \mathbf{A} + \beta \mathbf{B} + \gamma \mathbf{C}$$

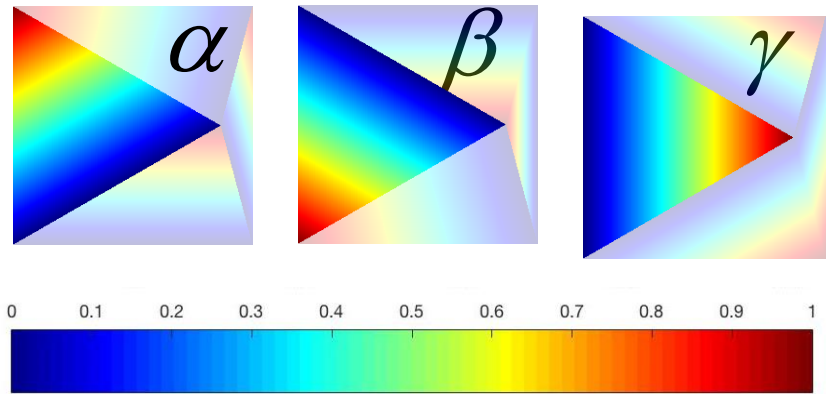
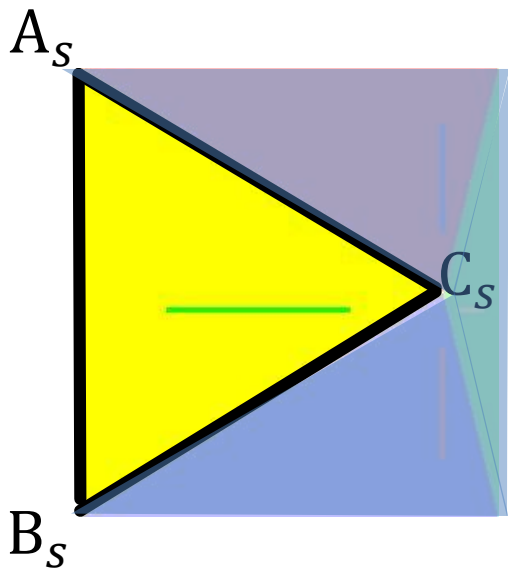


Warping with Barycentric Coordinate

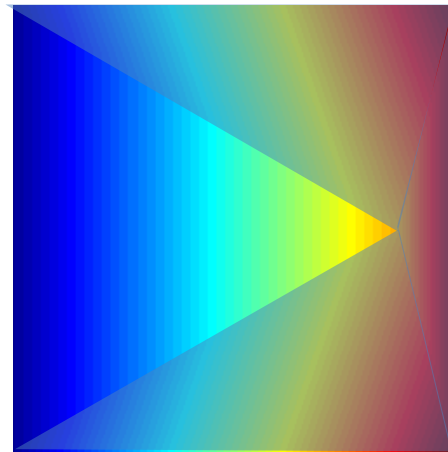
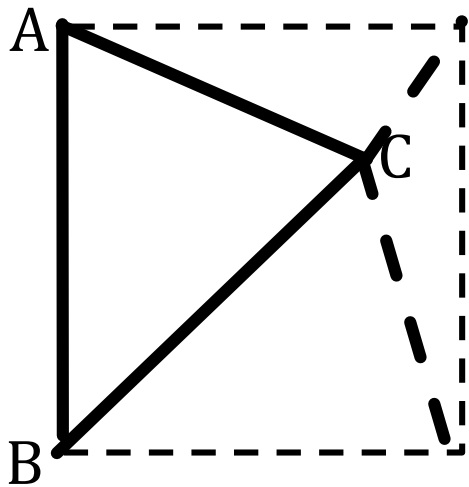


$$\begin{bmatrix} A_x & B_x & C_x \\ A_y & B_y & C_y \\ 1 & 1 & 1 \end{bmatrix} \begin{bmatrix} \alpha \\ \beta \\ \lambda \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

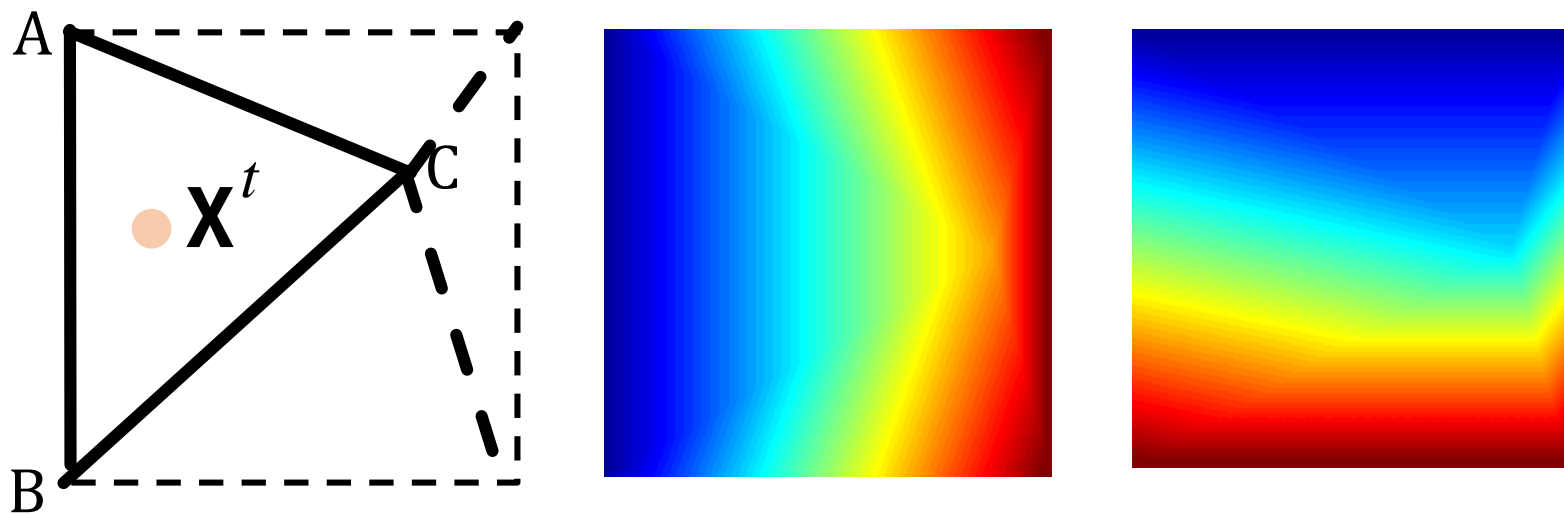
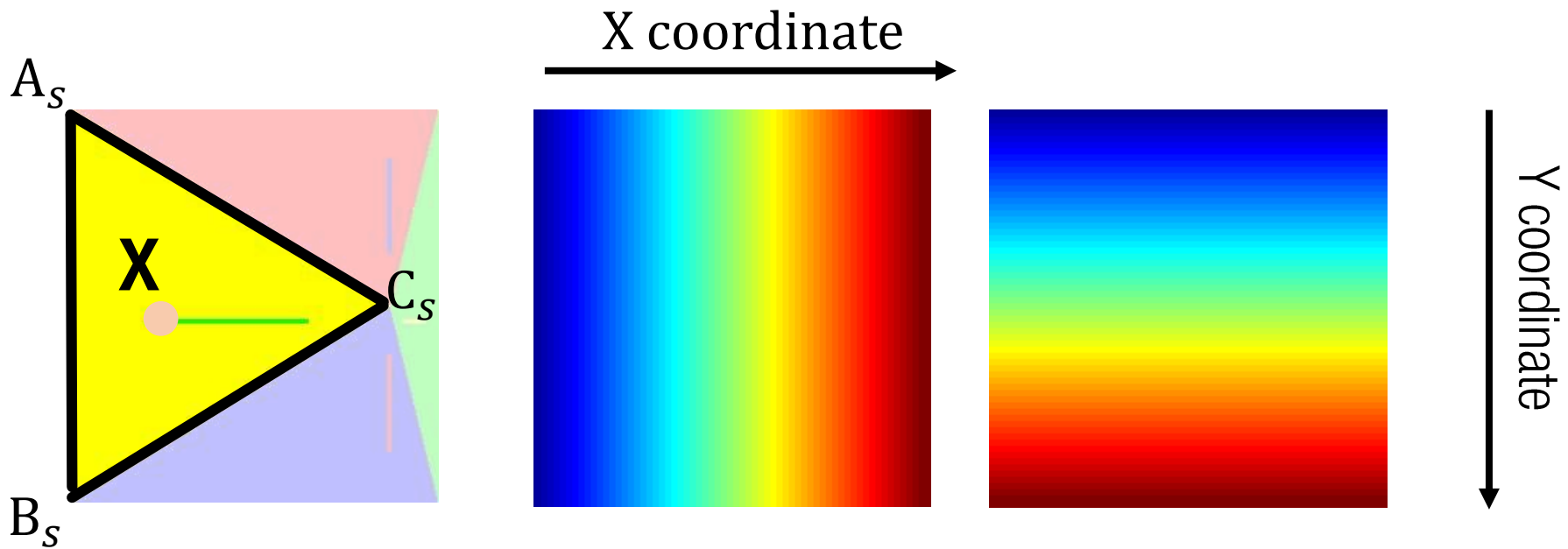




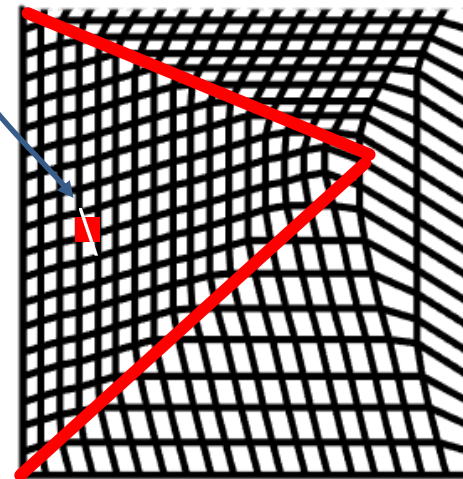
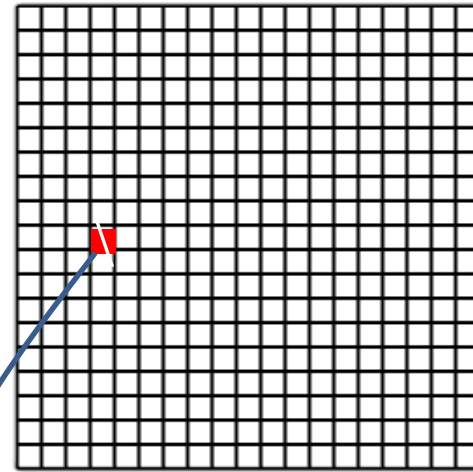
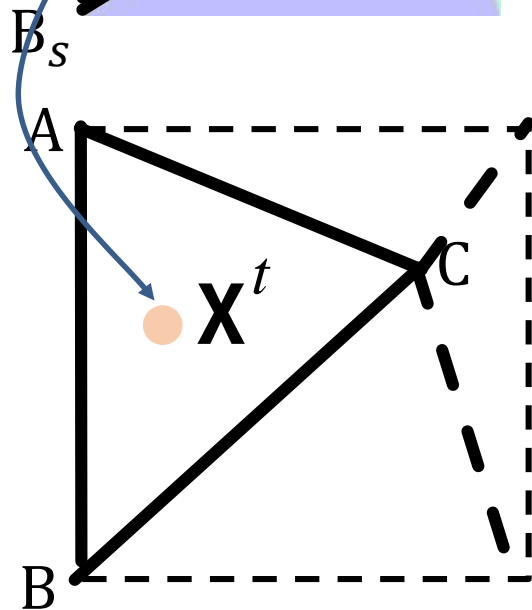
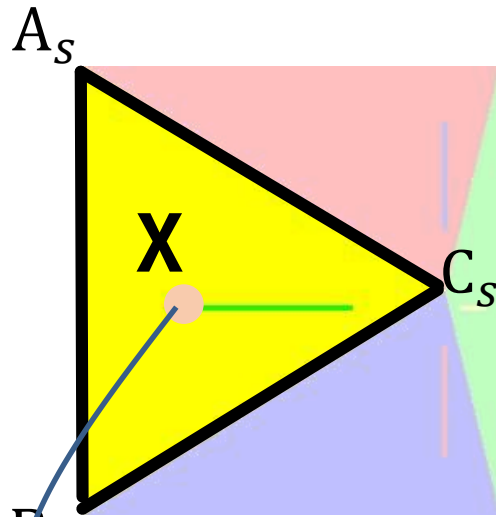
$$\mathbf{x}_t = \alpha \mathbf{A} + \beta \mathbf{B} + \gamma \mathbf{C}$$



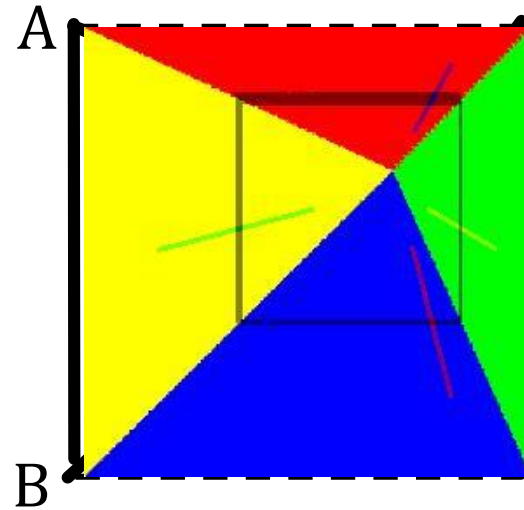
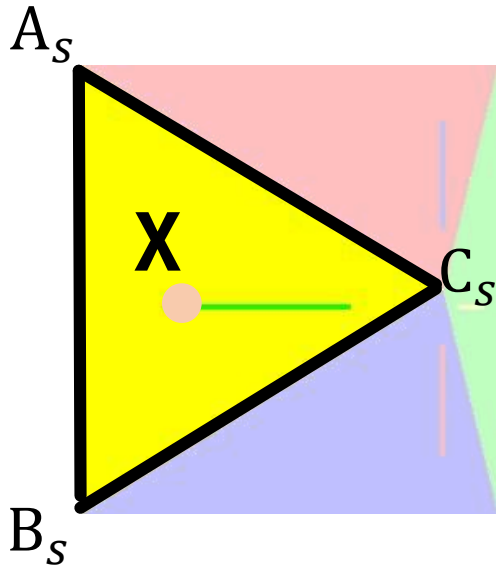
Warping with Barycentric Coordinate



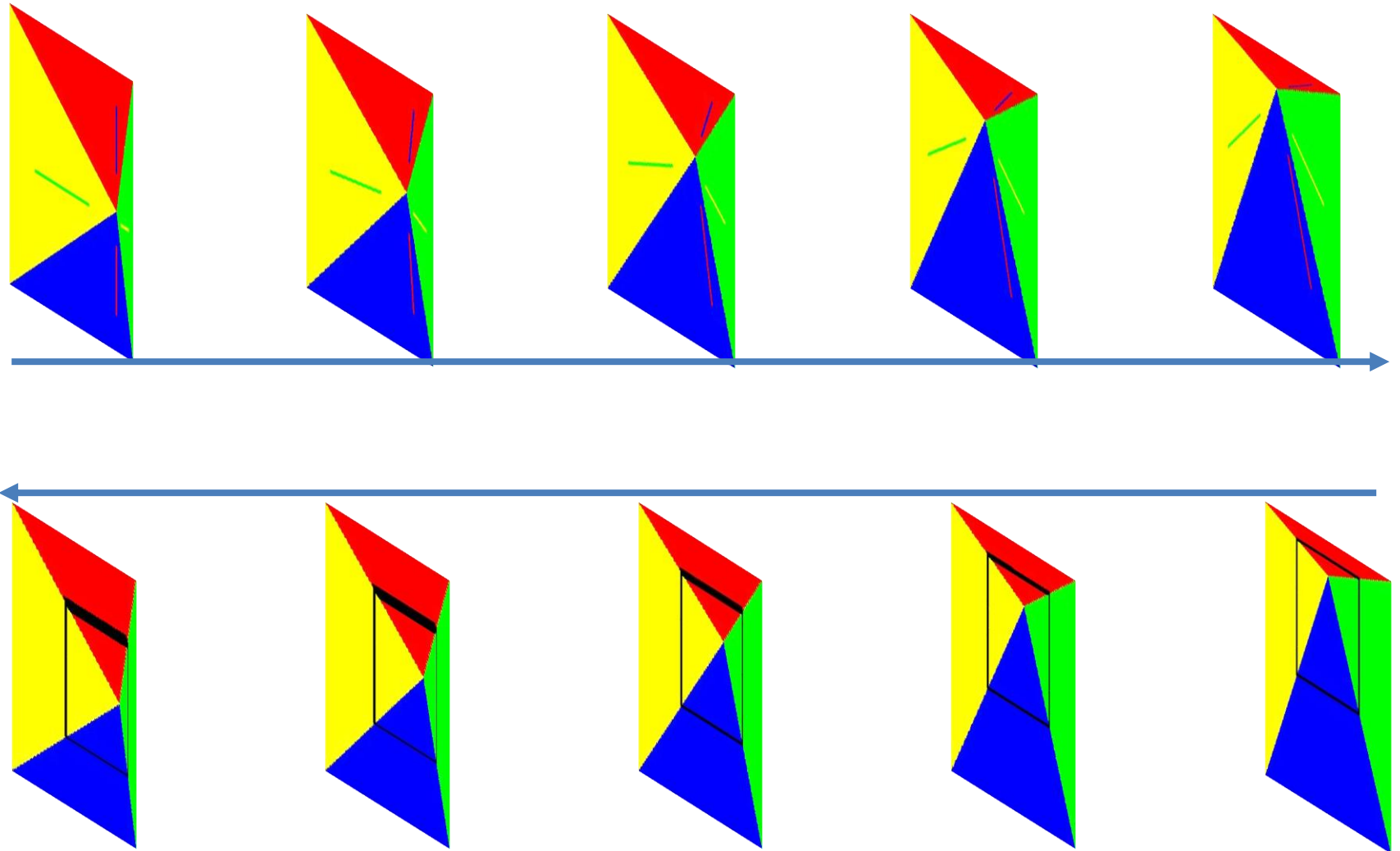
Grids before and after warping



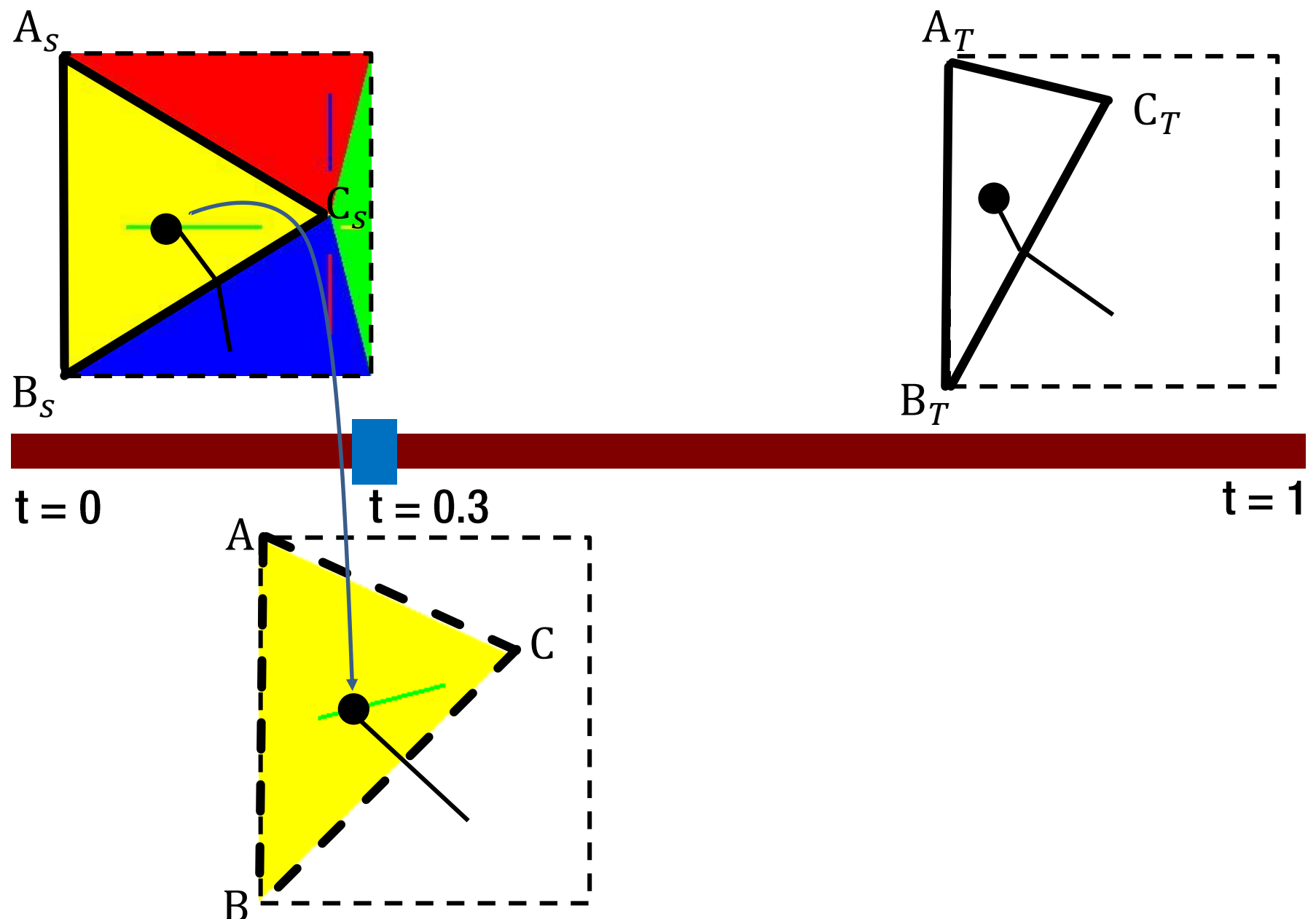
Step 3: Average warped image



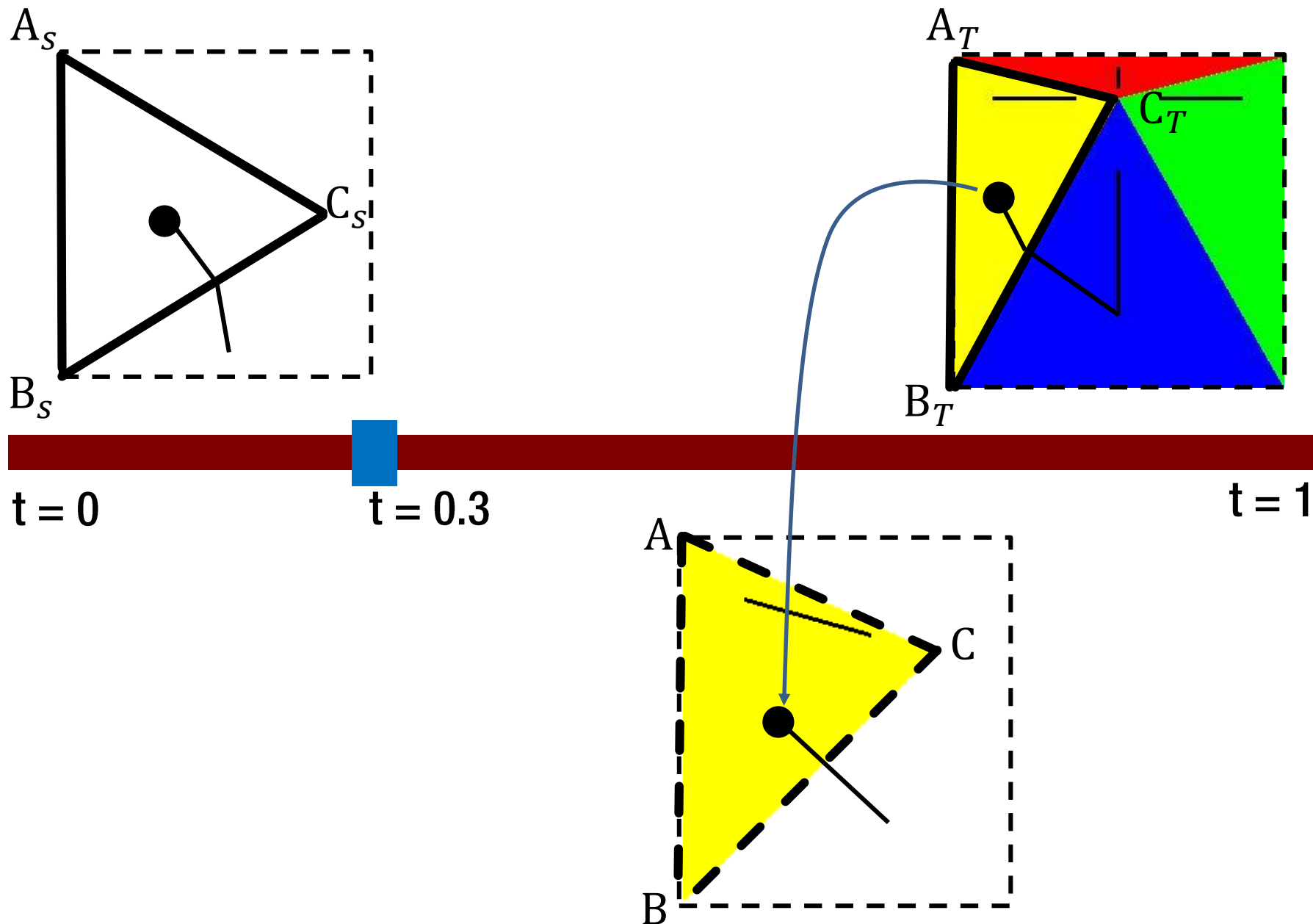
Warping and Cross Dissolve



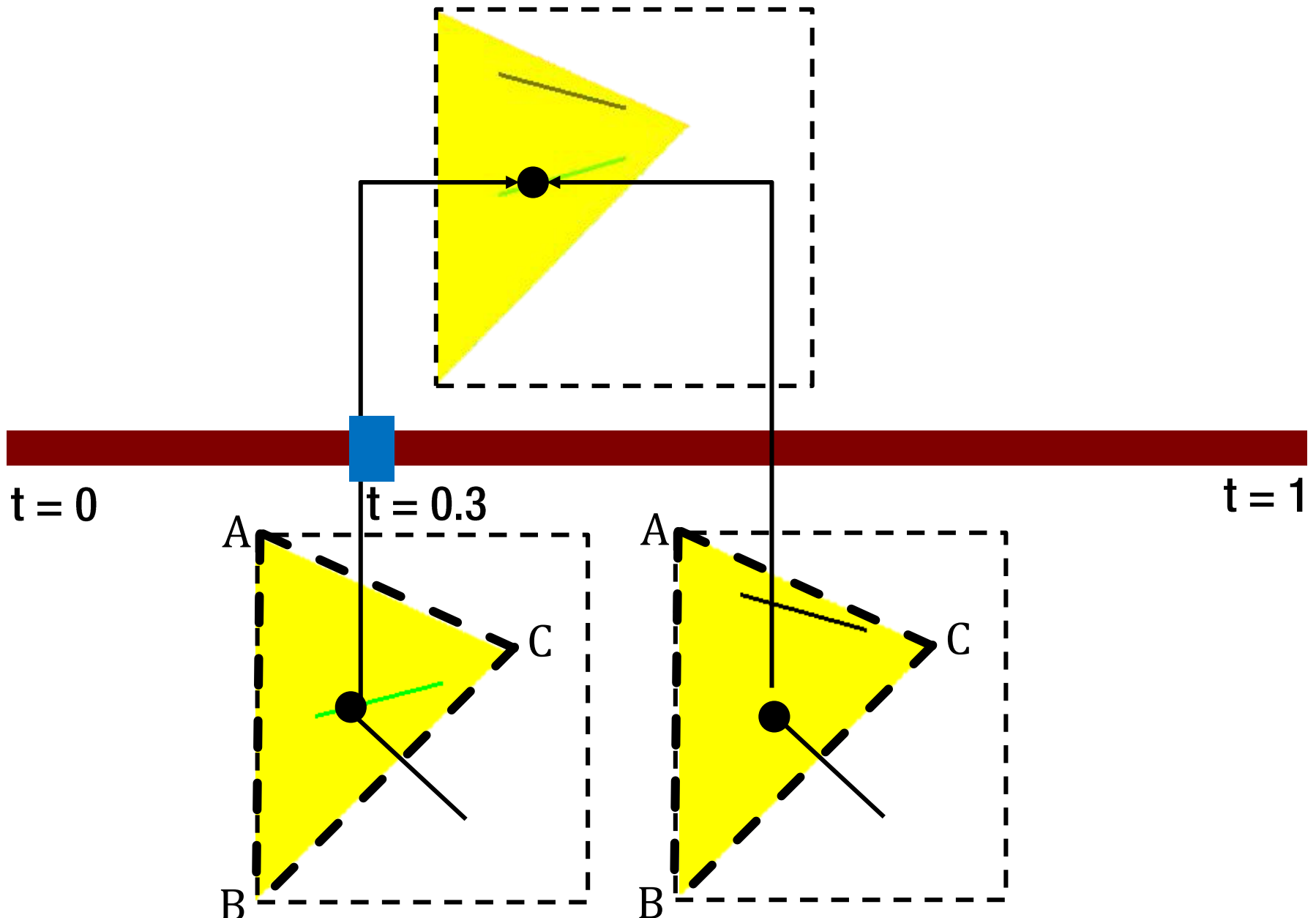
Inverse warping from the source image



Inverse warping from target image



Step 3: averaging warped image



Warping, then cross-dissolve



Morphing procedure:

for every t ,

1. Find the average shape
2. Non-parametric warping
3. Find the average color
 - Cross-dissolve the warped images