Three-Dimensional Facial Model Reconstruction and Plastic Surgery Simulation

Tong-Yee Lee, Yung-Nien Sun, Yung-Ching Lin, Leewen Lin, and Chungnan Lee

Abstract—Facial model reconstruction and surgical simulation are essential to plastic surgery in today's medicine. Both can help surgeons to design appropriate repair plans and procedures prior to actual surgery. In this paper, we exploit a metamorphosis technique in our new design. First, using metamorphosis and vision techniques, we can establish three-dimensional facial models from a given photo. Second, we design several morphing operators, including augmentation, cutting, and lacerating. Experiments show that the proposed algorithms can successfully create acceptable facial models and generate realistically visual effects of surgical simulation.

Index Terms— Facial model reconstruction, metamorphosis, morphing operators, surgical simulation.

I. INTRODUCTION

N HOSPITALS, plastic surgery is a routine procedure to correct congenital deformities or to treat the deformities caused by accidents. Precise presurgical planning can help surgeons to reduce the potential of risks in plastic surgery. In the past, there have been several related researches proposed. Koch et al. [1] proposed algorithms in both presurgical planning and postsurgical evaluation. In this method, the facial surgery is realistically simulated using finite element methods. In [2], physically based modeling was developed to generate facial expression. However, this approach is computationally very expensive; it is not practical in real-time surgical simulation. In forensic medicine, several studies have been proposed for facial reconstruction [3]–[5]. The goal of these studies is to reconstruct the face of a deceased person from the skull of a given cadaver. Additionally, many researchers are interested in developing patient-specific implants [6], [7]. In this paper, we propose algorithms for generating three-dimensional (3-D) facial models and for simulating surgical operations. In contrast to previous studies, we exploit the metamorphosis technique to accomplish both tasks. As a result, this new approach generates an acceptable quality of facial models and simulates realism of surgical operations.

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Metamorphosis or warping is a powerful technique to transform one image or a 3-D model into another [8]–[10]. In the past, it has been widely used in the entertainment industry. In [9], two-dimensional (2-D) warping was classified as follows: mesh morphing, field morphing, radial basis functions, thin plate splines, and energy minimization. In this paper, we primarily use a feature-based volume morphing technique [8] in our design. This is a new application of metamorphosis to surgical simulation. This novel approach enables us to establish facial models and simulate surgical operations.

This paper is organized as follows. Section II will briefly review the 3-D metamorphosis technique used in this paper. Section III will present the framework of 3-D facial model reconstruction. The proposed morphing operators and their applications in plastic surgery are described in Section IV. Finally, concluding remarks and trends of future work are given in Section V.

II. FEATURE-BASED THREE-DIMENSIONAL METAMORPHOSIS

The feature-based volume metamorphosis consists of two major steps, warping and blending [8], as illustrated in Fig. 1.

First, it warps the source and target volumes S and T into intermediate volumes according to several user-specified features. These features will define the transition of morphing between S and T. The contribution of each feature to morphing is calculated by a weight function. This weight function is in proportion to d^{-2} , where d is the distance from the voxel to a corresponding feature. Second, it blends the density of two intermediate volumes to form a morphed volume. For more details, the reader is referred to [8] and [10].

III. THREE-DIMENSIONAL FACIAL MODEL RECONSTRUCTION

A good facial model is helpful for plastic surgeons to design repair plans. In some situations, for example, traffic accidents, it is hard to obtain preaccident facial models of patients except for past photos. In this section, we will present a framework of facial model reconstruction. In this framework, the reconstruction can be accomplished from a patient's photo, as shown in Fig. 2. This framework is summarized as follows. We select a generic facial model from a database to fit a given photo. The shape of the generic model is refined to the desired model using the metamorphosis technique and 3-D pose information. We acquire 3-D pose information of the given photo using a computer vision technique [11]. Three major components of



Fig. 1. Feature-based volume metamorphosis.



Fig. 2. A framework of 3-D facial model reconstruction.



Fig. 3. The triangulation of two consecutive contours, P and Q.

this framework will be further explained in the following subsections.

A. Creation of Generic Facial Model

We create generic facial models from the medical CT head data using the following steps. First, we use image processing packages to extract a set of contours corresponding to the facial surface on CT data. Then, every two consecutive contours will be linked together to approximate the facial model. Assume two consecutive contours P and Q are defined by a sequence of feature points, where $P = \{P_1, P_2, P_3, \dots, P_m\}, Q =$ $\{Q_1, Q_2, Q_3, \dots, Q_n\}$ and m > n. We achieve their connection using triangular patches in three steps (as shown in Fig. 3). First, we link each point of P to the nearest point on the contour Q. Next, each remaining point (not yet linked by P in the first step) of Q will be linked to the nearest point on the contour P. After these two steps, we create many patches between P and Q. Each patch is either a triangle or a quadrangle. Finally, each quadrangular patch will be divided



Fig. 4. CT head representations (a) Wire frame. (b) Volume rendering.

into two triangles as equilateral as possible. The wire frame of a 3-D facial model created using the above method and a volume rendering of the same CT data are shown in Fig. 4. Both representations of the CT head are quite similar.

B. Pose Determination of Human Faces from a Photo

We acquire pose information of human faces to register a generic facial model with a virtual one (i.e., defined by a photo). For this purpose, we adopt techniques developed in [11] as shown in Fig. 5. In this method, there are four userspecified points on a given photo: P_1 , P_2 (two corners of the eyes) and P_3 , P_4 (two corners of the mouth), as shown in Fig. 6. Let P_5 and P_6 be the centers of $\overline{P_1P_2}$ and $\overline{P_3P_4}$. It makes following assumptions: 1) points P_1 , P_2 , P_3 and $\overline{P_4} = \text{coplanar}$; 2) $\overline{P_1P_2}/\overline{P_3P_4}$; and 3) $\overline{P_1P_2} \perp \overline{P_5P_6}$ and $\overline{P_3P_4} \perp \overline{P_5P_6}$. In [11], the required steps to determine 3-D pose information is described as follows. In Fig. 5, both n_p and n_q are calculated by $\overline{Cp_1'} \times \overline{Cp_2'}$ and $\overline{Cp_3'} \times \overline{Cp_4'}$, where $\overline{Cp_1'} = (x_1', y_1', f)$, $\overline{Cp_2'} = (x_2', y_2', f)$, $\overline{Cp_3'} = (x_3', y_3', f)$, and $\overline{Cp_4'} = (x_4', y_4', f)$. The parameter f is the focal length of



Fig. 5. The perspective projection geometry of a facial model [11].



Fig. 6. A photo of a 3-D facial model, where P_5 and P_6 are the middle points of line segments $\overline{P_1 P_2}$ and $\overline{P_3 P_4}$, respectively, and $\overline{P_7 P_8}$ is the same direction as N_f (facial normal vector).

the camera. We obtain the eye-line unit vector $N_e(u, v, w)$ by $(n_p \times n_q)/(||n_p \times n_q||)$. Next, we can determine 3-D positions of P_1 and P_2 using projective geometry [11] and let $L_e = ||\overline{P_1P_2}||$ and $\overline{P_1P_2}$ is denoted as (U, V, W). Similarly, since $\overline{P_1P_2}/\overline{P_3P_4}$, we can determine P_3 and P_4 by $\overline{P_3P_4}$. Notice that P_5 and P_6 are the centers of $\overline{P_1P_2}$ and $\overline{P_3P_4}$, so their values can be determined also. Now, P_3 , P_4 , and P_6 are known and we can determine facial axis unit vector N_s by $\overline{P_5}\overline{P_6}/|P_5P_6|$. Finally, we can determine the facial normal vector N_f by $N_s \times N_e$. Let P_7 be the center of $\overline{P_5P_6}$ and assume the lengths of $\overline{P_7P_6}$ and $\overline{P_7P_8}$ are equal. Then, $\overline{P_7P_8}$ can be derived by $\|\overline{P_7P_6}\| \times N_f$. The algorithms described in [11] do not need to know $\|\overline{P_1P_2}\|$ and $\|\overline{P_3P_4}\|$ in advance, and both lengths can be derived from the following relations: $\overline{P_1P_2} \perp \overline{P_5P_6}$, $\overline{P_3P_4} \perp \overline{P_5P_6}$, and $\overline{P_5P_6} \bullet N_e = 0$. For more details, please refer to [11]. In the following subsection, we will show how to apply these eight points (P_1, \dots, P_8) and three facial vectors (N_e, N_s, N_f) to perform registration and metamorphosis.

C. Registration and Metamorphosis of Facial Models

We need to specify a set of feature pairs to compute metamorphosis. The correct correspondence of each feature pair is the key to the success of facial model reconstruction.



Fig. 7. The generic facial model is transformed to the RCS system.

Therefore, we need to correctly register the generic model with the virtual one (defined by the given photo) prior to metamorphosis. In this paper, we assume that generic and virtual models both have equal lengths of $\overline{P_1P_2}$. First, we will select eight points, $P_1 \cdots P_8$, on the generic facial model. The reference coordinate system (RCS), as shown in Fig. 7, is defined as follows: the origin is at P_7 , and N_e, N_s , and N_f are vectors are the X, Y, and Z axes, respectively. Next, we transform both models to the RCS system and thus both models are registered (i.e., they share the same 3-D pose). After this stage, we can safely add additional features to both models to control the transition of the metamorphosis. Notice that this stage must be performed after registration is accomplished. Otherwise, we risk the potential to yield incorrect correspondence of features due to perspective projection. Finally, we calculate metamorphosis using these selected feature pairs.

On a given photo, each feature point (x_i, y_i) corresponds to a 3-D point $(t * x_i, t * y_i, t * f)$ on the virtual facial model, where t is a real number and f is the focal length of camera. During registration, it is transformed to the RCS system and it is denoted as A_i (i.e., $\{X_i, Y_i, Z_i, 1\}$), where

$$A_{i} = \begin{bmatrix} X_{i} \\ Y_{i} \\ Z_{i} \\ 1 \end{bmatrix} = \begin{bmatrix} N_{ex} & N_{ey} & N_{ey} & 0 \\ N_{sx} & N_{sy} & N_{sz} & 0 \\ N_{fx} & N_{fy} & N_{fz} & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$
$$\cdot \begin{bmatrix} 1 & 0 & 0 & -X_{7} \\ 0 & 1 & 0 & -Y_{7} \\ 0 & 0 & 1 & -Z_{7} \\ 0 & 0 & 0 & 1 \end{bmatrix} \cdot \begin{bmatrix} t_{i} * x_{i} \\ t_{i} * y_{i} \\ t_{i} * f \\ 1 \end{bmatrix}$$
$$= M \begin{bmatrix} t_{i} * x_{i} \\ t_{i} * y_{i} \\ t_{i} * f \\ 1 \end{bmatrix}$$

and

$$\cdot \begin{bmatrix} t_i * x_i \\ t_i * y_i \\ t_i * f \\ 1 \end{bmatrix}$$
$$= M^{-1} * A_i.$$

Next, we determine t_i as follows. Assume the correspondence of A_i is C_i on the generic model. We transform C_i by $M^{-1} * C_i$. Since we can not recover depth information solely from a single photo, we estimate Z_c using X_c (i.e., the depths of two models are equal), and then we can have t_i . In this manner, we can estimate 3-D positions of all feature points, and, thereafter, we can compute metamorphosis.

D. Results and Discussions

To verify the proposed framework, Fig. 8 shows an example of facial model reconstruction. The generic 3-D model [Fig. 8(a)] is created using algorithms described above, and a single photograph of an individual is shown in Fig. 8(b). First, we select four corners of the eyes and mouth on this photo. Then, both figures were registered using 3-D pose information. Thereafter, additional feature points (marked in both figures) are selected to control the transition of the morphing (13 points in this example). Fig. 8(c) shows the final result in this experiment. Several interesting observations will be pointed out here. The shape of the nose fits very well in this experiment [see Fig. 8(b) and (c)]. The eyes of the CT head are always close, so the generic facial model always lacks detailed geometry of the eyes [see Fig. 8(a) and (c)]. Additionally, there are only four feature points used to control the shape of the eyes. Therefore, it does not yield good results for the eyes. One possible solution to this problem is to exploit multiple views of an individual face rather than a photo to reconstruct facial models. However, generally, it is hard to find several closely related photos of patients, in particular, in accidents. In this situation, a photo on the patient's personal ID is always available. Actually, from our experience, surgeons are satisfied with the current results created from patient ID's. In case of requiring highly realistic model reconstruction,





(d)

Fig. 8. Model-morphing process. (a) Generic face model (shaded by surface rendering). (b) A given photo marked with feature points. (c) The reconstructed facial model using 13 feature points (side view and front view). (d) The result using 25 feature points (side view and front view).

multiple relevant views of photos and good camera registration are unavoidable. Additionally, the process of extracting the texture maps is necessary for rendering photorealistic images of a reconstructed face model from various viewpoints. These issues are beyond the scope of this paper and will be our future work. Finally, we show one extra result [as shown in Fig. 8(d)] created by adding more features (25 points in this case). We see a better facial model reconstruction is obtained.

IV. PLASTIC SURGERY SIMULATION USING MORPHING

Three-dimensional metamorphosis has been exploited to create special visual effects. In this paper, we design several morphing operators to simulate surgical operation. These morphing operators globally or locally deform volume data and can the yield desired visual effect. To compute metamorphosis, for a given feature pair (e_s, e_t) , we will find a point p' in the target volume that corresponds to p in the source volume by inverse mapping. We propose three morphing operators, namely, augmentation, cutting, and lacerating, respectively. These manipulations are common in plastic surgery. In our design, the features include points and line segments.

A. Augmentation Operator

When we want to achieve the visual effect of augmentation on human faces, we can impose an augmentation operator on the patient's facial model. In our design, this operator is



Fig. 9. Augmentation operator.



Fig. 10. An example of nose augmentation.

defined by (F_s, F_t) , where each F_i consists of nine features denoted as $\langle e_0, e_1-e_8 \rangle$. The corresponding point p in the source volume can be computed using the following equation:

$$\frac{\sum_{i=1}^{8} W_i p' + W_0 p_0}{\sum_{i=0}^{8} W_i}.$$

The design of this operator is shown in Fig. 9. In this design, the (e_0, e'_0) pair is used to control the effect of augmentation. Note that the morphing effect achieved in [8] is global. Therefore, we need some special arrangement to freeze the area that will not be augmented. The $\langle e_1 - e_8 \rangle$ and $\langle e_1' - e_8' \rangle$ are the same line segments; they are used to freeze the area of volume bounded by these eight line segments. Hence, the positions of p_1-p_8 will be the same as p', where p_i is the correspondence of p' under a feature e'_i . Furthermore, since any p' in the area bounded by $\langle e'_1 - e'_8 \rangle$ is far from e'_0 , it is less influenced by this feature point. Therefore, any p' contained in this area can be seen as being unchanged (i.e., frozen). Fig. 10 illustrates an example of augmentation. The original MRI head volume data and nine specified features are illustrated in Fig. 10(a). The feature point e_0 is placed on the nose. Next, in Fig. 10(b), we translate e_0 to a new position e'_0 that results in an augmentation of the nose. Furthermore, by placing a new feature point, the nose can be further pulled longer [Fig. 10(c)] on the basis of intermediate volume [Fig. 10(b)].

Before we introduce two other operators, we give some background information about them. Our design consists of three steps: 1) for a given p' and a feature e'_i , we compute p_i as described above; 2) we can further modify p_i by $p' + \text{field} \times (p_i - p')$, if it is required; and 3) we also can modify the weight function, if it is necessary. In the second step, the field is a potential field and its general term is defined

by $(1-(d^2/D^2))^k$, where d is the distance from p' to a feature e'. The parameter D is a constant to define the potential, and k is also a constant and its value is dependent on material characteristics.

B. Cutting Operator

When performing plastic surgery, it is often required to cut away or remove deformities from human faces. This cutting operation can be simulated using morphing as follows. First, we specify two feature line segments $\langle L_s, L_s \rangle$ (i.e., the same line segments) on the source volume and $\langle L_1, L_2 \rangle$ on the target volume, respectively. The angle spanned by L_1, L_2 is used to define the crack on the patient's deformities as shown in Fig. 11(a). In practice, we can just simply give a cutting angle, θ , and then use simple geometry to compute $\langle L_1, L_2 \rangle$ by means of L_s . The cutting effect is governed by the following formulas:

$$p_{i} = \begin{cases} p', & \text{if } d > D \text{ or } u_{i} > 1\\ p' + \left(1 + \frac{d^{2}}{D^{2}}\right)^{k}(p_{i} - p'), & \text{if } d \leq D \end{cases}$$
$$u_{i} = \frac{(p' - P_{i}) \cdot (Q_{i} - P_{i})}{||Q_{i} - P_{i}||^{2}}$$
$$w_{i} = \begin{cases} 0, & \text{if } \overrightarrow{cp'} \cdot \overrightarrow{n_{i}} > 0\\ w_{i}, & \text{if } \overrightarrow{cp'} \cdot \overrightarrow{n_{i}} \leq 0. \end{cases}$$

In the above formulas, the correspondence of p' will be influenced to a greater extent by a potential field. In contrast to [8], this morphing effect is local rather than global. If d is larger D, p' will not be influenced. Additionally, the parameter u_i is defined as the position of p' along the feature line P_iQ_i . If $u_i > 1$, it means p' is out of the range defined by $\langle L_1, L_2 \rangle$. Hence, under this condition, p' will not be influenced either. This operator generates two cutting planes and their normal vectors are n_1 and n_2 . Let point c be the center of L_1 or L_2 . If point p' is contained in the cutting area, we assign 0 to the corresponding weight function. In other words, point p' is morphed into an empty voxel on the source volume. In our experiment, the parameter k varies from 1 to 4. Fig. 11(b) shows an example of cutting into an MRI head. In this example, we specify a line segment L_s and a cutting angle θ (60°) to control the cutting effect.

C. Lacerating Operator

Another common routine in plastic surgery is the lacerating operation. The surgeons use knives to lacerate a breach on the facial surface. The proposed lacerating operator is composed of two steps. First, we use a cutting operator to generate a breach on facial models. Next, we enlarge this breach by a scaling operator defined by the following equation:

$$p_i = \begin{cases} p', & \text{if } d > D\\ p' + \left(1 - \frac{d^2}{D^2}\right)^2 (p_i - p'), & \text{if } d \le D. \end{cases}$$

To virtually enlarge a breach, we will specify a line segment pair $\langle e, e' \rangle$ and a potential constant D [as shown in Fig. 12(a)].



Fig. 11. (a) Cutting operator. (b) An example of the cutting operation.



Fig. 12. (a) A scaling operator. (b), (c) Examples of the lacerating operation.

In this design, actually, the feature e is equal to e' but they have different lengths. The distance from p' to e' is denoted as d. If d is less than D, then p' will be influenced by this operator. In Fig. 12(b) and (c), there are two concentric spheres, where the smaller one is inside the larger one. In this example, we first use a cutting operator to create a crack on the outer sphere and then enlarge the crack using a scaling operator.

V. CONCLUSION AND FUTURE WORK

In this paper, we investigate 3-D metamorphosis techniques toward two goals: 1) facial model reconstruction and 2) realistic simulation of surgical operations. To reconstruct a facial model, we first estimate the 3-D pose of a human face from a given photo. Next, using this pose information, we register the generic face model with the given photo. Hereafter, several corresponding features are selected to perform shape refinement on the generic model using the morphing technique. Current results provide acceptable facial models for our collaborating surgeons in their performance of plastic surgery. However, some portion of the face was not successfully reconstructed, for example, the eyes. The main reason is because not enough 3-D information can be recovered from a given photo. Future improvement can be pursued in reconstructing facial models from multiple photos.

We also proposed several morphing operators to simulate surgical operations. These operators can be either global (augmentation) or local (cutting and lacerating). To simulate a surgical operation, we can place suitable operators on damaged parts in an intuitive manner. We can easily use several operators in turn to simulate the desired operation. Finally, we plan to design more types of operators such as twisting. We will use these morphing operators in our surgical simulation project in collaboration with the Hospital of National Cheng-Kung University in Taiwan.

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