

A Nested Variational Time Discretization for Parametric Willmore Flow

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Abstract

A novel variational time discretization of isotropic and anisotropic Willmore flow combined with a spatial parametric finite element discretization is applied to the evolution of polygonal curves and triangulated surfaces. In the underlying natural approach for the discretization of gradient flows a nested optimization problem has to be solved at each time step. Thereby, an outer variational problem reflects the time discretization of the actual Willmore flow and involves an approximate L^2 -distance between two consecutive time steps and a fully implicit approximation of the Willmore energy. The mean curvature needed to evaluate the integrand of the latter energy is replaced by the time discrete, approximate speed from an inner, fully implicit variational scheme for mean curvature motion. To solve the resulting PDE constrained optimization problem at every time step duality techniques from PDE optimization are applied. Computational results underline the robustness of the new scheme, in particular with respect to large time steps, and show applications to surface restoration and blending.

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1 Introduction

This paper presents a new variational schemes for the time and space discretization of parametric isotropic and anisotropic Willmore flow. Willmore flow is defined as the geometric gradient flow of the Willmore energy with respect to the L^2 -metric, where the Willmore energy for a d -dimensional surface \mathcal{M} embedded in \mathbb{R}^m with $m \geq d + 1$ is defined as

$$w[x] := \frac{1}{2} \int_{\mathcal{M}[x]} \mathbf{h}^2 \, da,$$

with x denoting a parametrization of $\mathcal{M} = \mathcal{M}[x]$, \mathbf{h} the mean curvature, and the L^2 -metric $g_x(v_1, v_2) = \int_{\mathcal{M}[x]} v_1 v_2 \, da$ is defined on variations $x + v_i n$ of the surface \mathcal{M} in the direction of the surface normal n . Here, the mean curvature \mathbf{h} itself represents the L^2 -gradient of the area functional $a[x] = \int_{\mathcal{M}} da$ and equals the sum of the principal curvatures. In the hypersurface case ($m = d + 1$) Willmore flow leads to the fourth order parabolic evolution problem

$$\partial_t x = \Delta_{\mathcal{M}} \mathbf{h} n + \mathbf{h} \left(|S|_2^2 - \frac{1}{2} \mathbf{h}^2 \right) n,$$

which defines for a given initial surface \mathcal{M}_0 a family of surfaces $\mathcal{M}(t)$ for $t \geq 0$ with $\mathcal{M}(0) = \mathcal{M}_0$ [51, 49, 30]. Here, $\Delta_{\mathcal{M}}$ is the Laplace Beltrami operator on a surface \mathcal{M} , S denotes the shape operator on \mathcal{M} , and $|\cdot|_2$ the Frobenius norm on the space of endomorphisms on the tangent bundle $\mathcal{T}\mathcal{M}$. Applications of a minimization of Willmore energy and of Willmore flow evolution as the corresponding gradient flow include the modeling of edge sets in imaging [37, 35, 53, 10], surface modeling [50, 6, 5, 52] and extending the Willmore energy to the Helfrich energy the mathematical treatment of biological membranes [28, 48, 20]. The analytic treatment of the Willmore flow was investigated by Polden [42, 43]. Sharp estimates on long time existence and regularity were obtained by Kuwert and Schätzle [30, 31]. Willmore flow of curves has been studied by Dziuk, Kuwert, and Schätzle in [26]. Recently, Rivière [46] extended results of Kuwert and Schätzle [32] for co-dimension 3 to arbitrary co-dimension. He proved a weak compactness result for Willmore surfaces with energy less than 16π and a strong compactness of Willmore tori below the energy level 16π . He provided also a new formulation for the weak Euler–Lagrange equation of the Willmore functional for immersed surfaces in \mathbb{R}^m . The numerical results of Mayer and Simonett [34] suggest that the above estimate is optimal in the sense that the flow develops a singularity if the initial surface has energy greater than 16π .

In Finsler geometry the focus is on anisotropic area measurement encoded in the functional $a_{\gamma}[x] = \int_{\mathcal{M}} \gamma(n) \, da$ where the local area weight $\gamma(n)$ depends on the surface orientation via a positive 1–homogeneous anisotropy function γ . Now, in analogy to the isotropic case the anisotropic mean curvature \mathbf{h}_{γ} is defined as the L^2 -gradient of the anisotropic area $a_{\gamma}[\cdot]$ and can be evaluated as $\mathbf{h}_{\gamma} = \operatorname{div}_{\mathcal{M}}(\gamma_z(n))$. Hence, the *anisotropic* Willmore functional is given by $w_{\gamma}[x] = \frac{1}{2} \int_{\mathcal{M}} \mathbf{h}_{\gamma}^2 \, da$. Clarenz [12] has shown that Wulff shapes are the only minimizers. Recently, Bellettini & Mugnai [3] investigated the first variation of this functional in the smooth case. Clarenz [11] and Palmer [40, 41] studied variational problems involving anisotropic bending energies for surfaces with and without boundaries. Anisotropic Willmore flow of hypersurfaces can be rephrased as the following parabolic fourth order PDE

$$\partial_t x = \Delta_{\gamma} \mathbf{h}_{\gamma} n + \mathbf{h}_{\gamma} \left(|S|_{\gamma}^2 - \frac{1}{2} \mathbf{h}_{\gamma} \mathbf{h}_{\gamma} \right) n,$$

where $\Delta_{\gamma} := \operatorname{div}_{\mathcal{M}}(\gamma_{zz}(n) \nabla_{\mathcal{M}})$ is the generalized Laplace–Beltrami operator with $\operatorname{div}_{\mathcal{M}}$ and $\nabla_{\mathcal{M}}$ being the tangential divergence and gradient, respectively. Furthermore, $|S|_{\gamma}^2 = \operatorname{tr}(\gamma_{zz}(n) S^2)$ is the

weighted, squared Frobenius norm of the shape operator, and $\gamma_{zz} = D^2\gamma$ the second derivatives of the anisotropy function γ .

Concerning the numerical approximation of Willmore flow in the isotropic case, Rusu [47] proposed a mixed method for the surface parametrization x and the mean curvature vector $\mathbf{h}n$ as independent variables, see also [13] for an application to surface restoration. A level set formulation in the hypersurface case was presented in [19]. Deckelnick and Dziuk [14] investigated the convergence of a space discrete related scheme in the case of graph surfaces and Deckelnick and Schieweck demonstrated convergence of a conforming finite element approximation for axial symmetric surfaces [16]. An error analysis in the case of the elastic flow of curves was recently presented by Dziuk and Deckelnick in [15]. Furthermore, we refer to Barrett, Garcke and Nürnberg [1], Bobenko and Schröder [7] and Dziuk [25] for alternative numerical methods for Willmore flow on triangular surfaces. Diewald [17] has extended the approach of Rusu [47] to the parametric anisotropic Willmore flow for closed surfaces and Droske [18] and Nemitz [36] investigated a level set discretization. In [44] Pozzi discussed the Willmore flow of curves in higher co-dimension. The time discretization of the anisotropic mean curvature flow has been considered by Dziuk already in [23, 24] and he gave convergence results for curves.

Contrasting with fully explicit time discretizations — not mentioned here — the above numerical approaches are all characterized by some type of semi-implicit time discretization and require the solution of linear systems of equations at each time step. Roughly spoken geometric differential operators are assembled at the previous time step. Even though discrete energy estimates exist in many cases one observes practical restrictions on the time step size. This shortcoming motivated the development of a new concept for the time discretization of Willmore flow leveraging the variational time discretization of general gradient flows (first preliminary results on this approach have been presented in the proceedings article [39]). Given an energy $e[\cdot]$ on a (in general infinite dimensional) manifold with metric g and the gradient flow $\dot{x} = -\text{grad}_g e[x]$ with initial data x^0 one defines a sequence of time discrete solutions $(x^k)_{k=0,\dots}$ with $x_k \approx x(k\tau)$ for the time step size τ via a variational problem, to be solved in each time step, i.e.

$$x^{k+1} = \arg \min_x \text{dist}(x, x^k)^2 + 2\tau e[x],$$

where $\text{dist}(x, x^k) = \inf_{\gamma \in \Gamma[x^k, x]} \int_0^1 \sqrt{g_{\gamma(s)}(\dot{\gamma}(s), \dot{\gamma}(s))} ds$ is the Riemannian distance on the manifold from x to x^k defined as the length of the shortest path, where $\Gamma[x^k, x]$ denotes the set of smooth curves γ with $\gamma(0) = x^k$ and $\gamma(1) = x$. As an immediate consequence, one obtains the energy estimate $e[x^{k+1}] + \frac{1}{2\tau} \text{dist}(x^{k+1}, x^k)^2 \leq e[x^k]$. For geometric problems, this approach has already been considered by Luckhaus and Sturzenhecker [33] in the case of mean curvature motion via a fully implicit variational time discretization in BV . Chambolle [8] investigated a reformulation of this approach in terms of a level set method. A related method for anisotropic mean curvature motion is discussed in [2, 9].

Here, we build upon this concept and proceed as follows in the case of Willmore flow. We aim at

balancing the squared distance of the unknown surface at time $t_{k+1} = t_k + \tau$ from the current surface at time t_k and a suitable approximation of the Willmore energy at time t_{k+1} scaled by twice the time step size. Solving a fully implicit time discrete problem for mean curvature motion for the unknown surface at time t_{k+1} , we can regard the resulting discrete speed of evolution as a time discrete, fully implicit approximation of the mean curvature vector. This approximate mean curvature vector is then used to approximate the Willmore functional. Thus, we resort a nested minimization problem within each time step, where an inner problem solves for an implicit mean curvature vector, while an outer problem reflects an actual implicit, variational formulation for a time step of Willmore flow. As it will be discussed in detail the resulting nested time discretization experimentally turns out to be unconditionally stable and effectively allows for time steps of the order of the spatial grid size. Furthermore, the approach can be generalized to anisotropic Willmore flow.

The paper is organized as follows. In Section 2 we derive time discretizations for isotropic Willmore flow of compact surfaces and for surfaces with boundaries on which C^1 boundary conditions are prescribed. Furthermore, we generalize the approach to anisotropic Willmore flow. Then in Section 3 we discuss a fully discrete numerical scheme based on piecewise affine finite elements on simplicial surface meshes. In Section 4 the duality technique from PDE constraint optimization is revisited to develop suitable minimization algorithms for the optimization problems to be solved in each time step. Finally, in Section 5 computational results are presented. An appendix collects essential ingredients of the corresponding algorithms to facilitate the implementation.

2 Nested time discretization of Willmore flow

In this section we will apply the concept of natural time discretization to Willmore flow and derive a nested (but still spatially continuous) variational problem for each time step. To begin with, we recall the corresponding time discretization of mean curvature motion. Let us consider a surface $\mathcal{M} = \mathcal{M}[x]$, where x indicates a parametrization of \mathcal{M} and can also be considered as the identity map on \mathcal{M} parametrizing \mathcal{M} over itself. Following the above abstract approach, we ask for the next time step $\mathcal{M}[y]$ with a corresponding parametrization $y = y[x]$ given as the minimizer of the functional $\text{dist}(\mathcal{M}[y], \mathcal{M}[x])^2 + 2\tilde{\tau} \int_{\mathcal{M}[y]} da$, where $\tilde{\tau}$ denotes the time step size. Here, $\text{dist}(\cdot, \cdot)$ is the L^2 -distance between surfaces, and $\int_{\mathcal{M}[y]} da$ is the surface area of $\mathcal{M}[y]$. Now, we take into account the straightforward linearization argument

$$2 \int_{\mathcal{M}[y]} da = (2 - d) \int_{\mathcal{M}[x]} da + \int_{\mathcal{M}[x]} |\nabla_{\mathcal{M}[x]} y|^2 da + O(\|y - x\|_{C^1}^2) \quad (2.1)$$

for parametrizations y which are C^1 close to x (here $\nabla_{\mathcal{M}[x]} y$ denotes the tangential gradient of y with respect to the surface $\mathcal{M}[x]$): For the proof of (2.1) we refer to Appendix A. Furthermore, observing that the minimization can be restricted to surface parametrizations y for which $y - x \perp \mathcal{M}[x]$ we obtain the following approximate variational problem for a single time step of mean curvature motion:

Given a surface $\mathcal{M}[x]$ parameterized by a mapping x we ask for a mapping $y = y[x]$ which minimizes the functional

$$e[x, y] := \int_{\mathcal{M}[x]} (y - x)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[x]} y|^2 da. \quad (2.2)$$

The resulting weak form of the corresponding Euler-Lagrange equation is

$$0 = \int_{\mathcal{M}[x]} (y - x) \cdot \theta + \tilde{\tau} \nabla_{\mathcal{M}[x]} y : \nabla_{\mathcal{M}[x]} \theta da \quad (2.3)$$

for smooth test functions θ defined on $\mathcal{M}[x]$, where $A : B = \text{tr}(A^T B)$. Obviously, this equation coincides with the classical scheme for a single semi-implicit time step of mean curvature motion proposed by Dziuk in [22].

2.1 Willmore flow on closed surfaces

The abstract variational time discretization of isotropic Willmore flow reads as follows

$$\text{dist}(\mathcal{M}[x], \mathcal{M}[x^k])^2 + \tau \int_{\mathcal{M}[x]} \mathbf{h}^2 da \rightarrow \min .$$

For the first term we consider the same approximation as above for mean curvature motion. For the Willmore energy, we now make use of the following observation. By definition the mean curvature $\mathbf{h} = \mathbf{h}[x]$ is the L^2 -gradient of the area functional on a surface $\mathcal{M}[x]$ and mean curvature motion is the corresponding gradient flow. Hence, the mean curvature vector $\mathbf{h}[x]n[x]$ with $n = n[x]$ denoting the normal on $\mathcal{M}[x]$ can be approximated by the difference quotient in time $\frac{y[x]-x}{\tilde{\tau}}$, where $y[x]$ is the minimizer of $e[x, \cdot]$ in (2.2) for time step size $\tilde{\tau}$. Thus, for small $\tilde{\tau}$ the functional $\frac{1}{2} \int_{\mathcal{M}[x]} \frac{(y[x]-x)^2}{\tilde{\tau}^2} da$ is an approximation the Willmore functional on $\mathcal{M}[x]$.

This enables us to derive an approximate variational time discretization of Willmore flow, which does not require the explicit evaluation of the mean curvature on the unknown surface $\mathcal{M}[y]$ at the next time step. In fact, for a given surface parametrization x^k of the surface $\mathcal{M}[x^k]$ at a time step k we define the functional

$$w[x^k, x, y] := \int_{\mathcal{M}[x^k]} (x - x^k)^2 da + \frac{\tau}{\tilde{\tau}^2} \int_{\mathcal{M}[x]} (y - x)^2 da ,$$

where we select $y = y[x]$ as the minimizer of (2.2) with time step size $\tilde{\tau}$. Finally, we obtain the following time discretization of Willmore flow:

Given an initial surface $\mathcal{M}[x^0]$ with parametrization x^0 we define a sequence of surfaces $\mathcal{M}[x^k]$ with parametrizations x^k for $k = 1, \dots$ via the solution of the following sequence of nested variational problem

$$x^{k+1} = \arg \min_x w[x^k, x, y[x]], \text{ where} \quad (2.4)$$

$$y[x] = \arg \min_y e[x, y]. \quad (2.5)$$

Thereby, the inner variational problem (2.5) is quadratic. Thus, the resulting Euler–Lagrange equation (2.3) is a linear elliptic PDE and we end up with a PDE constrained optimization problem for each time step.

To be more explicit, let us examine circles in the plane. Under Willmore flow circles expand according to the ODE $\dot{R}(t) = \frac{1}{2}R(t)^{-3}$ for the radius. In comparison to this we obtain for the nested variational time discretization with a slight misuse of notation

$$w[R_k, R, \tilde{R}] = 2\pi R_k(R - \tilde{R})^2 + 2\pi R\tau \frac{(R - \tilde{R})^2}{\tilde{\tau}^2}, \quad e[R, \tilde{R}] = 2\pi R \left((R - \tilde{R})^2 + \tilde{\tau} \frac{\tilde{R}^2}{R^2} \right),$$

for a time discrete radii R_k , R , and \tilde{R} . Thus, by a straightforward computation we deduce the nonlinear equation $\frac{R-R_k}{\tau} = \frac{1}{2} \frac{R^4 - 3R^2\tilde{\tau}}{(R^2 + \tilde{\tau})^3 R_k}$ to be solved for R as the radius at the next time step. This is indeed an implicit first order scheme for the above ODE.

2.2 Willmore flow with boundary conditions

Next, with the application to surface restoration in mind let us consider the case of bounded surfaces $\mathcal{M}[x]$ with a fixed boundary $\Gamma[x] = \partial\mathcal{M}[x]$ and aim at prescribing boundary conditions both for x and for the normal $n[x]$ — at least in an approximate sense — on $\Gamma[x]$. Therefore, we modify the inner minimization problem and consider an energy

$$e^\partial[x, y] = \int_{\mathcal{M}[x]} (y - x)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[x]} y|^2 \, da - 2\tilde{\tau} \int_{\Gamma[x]} n^{co} \cdot y \, ds \quad (2.6)$$

for given x and n^{co} , where n^{co} is the co-normal perpendicular to n and to the boundary $\partial\mathcal{M}$. Indeed, for smooth boundary $\Gamma[x]$ prescribing the co-normal is equivalent to prescribing the surface normal. The resulting weak form of the Euler Lagrange equation for fixed x and a minimizer $y[x]$ of $e^\partial[x, \cdot]$ in (2.6) is

$$0 = \int_{\mathcal{M}[x]} \frac{y-x}{\tilde{\tau}} \cdot \psi + \nabla_{\mathcal{M}[x]} y \nabla_{\mathcal{M}[x]} \psi \, da - \int_{\partial\mathcal{M}[x]} n^{co} \cdot \psi \, ds$$

for all test functions $\psi \in C^\infty(\overline{\mathcal{M}[x]})$. Hence, we obtain the time discrete mean curvature motion equation $\frac{y-x}{\tilde{\tau}} = \Delta_{\mathcal{M}[x]} y$ on $\mathcal{M}[x]$ and the boundary condition $\partial_{n^{co}[x]} y = n^{co}$ on $\Gamma[x]$, where $n^{co}[x]$

denotes the actual co-normal of $\mathcal{M}[x]$. If we assume that $y[x] - x$ converges to 0 in C^1 for $\tilde{\tau} \rightarrow 0$ for x being the minimizer of the energy $w[x^k, x, y]$ and for $y[x]$ minimizing $e^\partial[x, y]$, then we observe that

$$\partial_{n^{co}[x]}y = \nabla_{\mathcal{M}[x]}y \cdot n^{co}[x] \rightarrow \nabla_{\mathcal{M}[x]}x \cdot n^{co}[x] = n^{co}[x]$$

for $\tilde{\tau} \rightarrow 0$. Therefore, we obtain the approximate boundary condition $n^{co}[x] = n^{co} + o(1)$ on $\Gamma[x]$ with the usual Landau symbol $o(1) \rightarrow 0$ for $\tau \rightarrow 0$.

Alternatively, in particular in the context of surface restoration, we may assume that $\mathcal{M}[x]$ is the varying part of a larger surface $\widetilde{\mathcal{M}}[x]$ with an outer part \mathcal{M}^{ext} being fixed. Correspondingly, the parametrization x is extended to some parametrization x^{ext} outside of $\mathcal{M}[x]$. As before $\Gamma[x]$ is supposed to denote the boundary of $\mathcal{M}[x]$. Then, we again reformulate the inner minimization problem and take into account the energy

$$\tilde{e}^\partial[x, y] = \int_{\widetilde{\mathcal{M}}[x]} (y - x)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[x]}y|^2 da,$$

which coincides with the original energy $e[x, y]$ except that it is now integrated over the whole surface $\widetilde{\mathcal{M}}[x]$ and y is allowed to vary on $\widetilde{\mathcal{M}}[x]$. In this case we obtain as an Euler Lagrange condition $\partial_{n^{co}[x]}y[x] - \partial_{n^{co}[x^{\text{ext}}]}y[x] = 0$ on $\Gamma[x]$. Here, $n^{co}[x^{\text{ext}}]$ is the outer co-normal of \mathcal{M}^{ext} on $\Gamma[x]$. If, we assume as above that $y[x] - x \rightarrow 0$ for $\tilde{\tau} \rightarrow 0$, then

$$\begin{aligned} \partial_{n^{co}[x]}y[x] &\rightarrow \partial_{n^{co}[x]}x = n^{co}[x] \quad , \text{ and} \\ \partial_{n^{co}[x^{\text{ext}}]}y[x] &\rightarrow \partial_{n^{co}[x^{\text{ext}}]}x^{\text{ext}} = n^{co}[x^{\text{ext}}]. \end{aligned}$$

Hence, once again, $n^{co}[x] = n^{co}[x^{\text{ext}}] + o(1)$ on $\Gamma[x]$ with $o(1) \rightarrow 0$ for $\tau \rightarrow 0$, where in this case the co-normal $n^{co}[x^{\text{ext}}]$ is induced by the prescribed outer surface $\mathcal{M}[x^{\text{ext}}]$.

2.3 Anisotropic Willmore flow of closed surfaces

Finally, let us investigate the time discretization of anisotropic Willmore flow in the co-dimension 1 case for $m = d + 1$. The corresponding abstract variational time discretization reads as follows

$$\text{dist}(\mathcal{M}[x], \mathcal{M}[x^k])^2 + \tau \int_{\mathcal{M}[x]} \mathbf{h}_\gamma^2 da \rightarrow \min,$$

where $h_\gamma = \text{div}_{\mathcal{M}}(n_\gamma) = \text{div}_{\mathcal{M}}(\gamma_z \circ n)$ denotes the generalized mean curvature. This time we again replace the L^2 -distance between the two manifolds $\mathcal{M}[x]$ and $\mathcal{M}[x^k]$ by $\int_{\mathcal{M}[x]} |y - x|^2 da$ under the assumption of sufficient regularity of x and y . Moreover, as in the isotropic case, we make use of the fact that the L^2 -gradient of the anisotropic area functional is the generalized mean curvature and hence, the time discrete speed $\frac{y[x] - x}{\tilde{\tau}}$ extracted from a variational time discretization

of anisotropic curvature motion approximates the generalized curvature vector $h_\gamma[x]n[x]$ and can be used to approximate the anisotropic Willmore energy. In the anisotropic case we do not consider a linearization of the variational approach for generalized curvature motion as in the isotropic approach, but we define $y[x]$ to be the minimizer of the nonlinear functional

$$e_\gamma[x, y] = \int_{\mathcal{M}[x]} (y - x)^2 da + 2\tilde{\tau} \int_{\mathcal{M}[y]} \gamma(n[y]) da$$

in y for given parametrization x . Then, collecting the different building blocks we end up with the following fully nonlinear variational time discretization of anisotropic Willmore flow:

$$\begin{aligned} x^{k+1} &= \arg \min_x w[x^k, x, y[x]], \quad \text{where} \\ y[x] &= \arg \min_y e_\gamma[x, y]. \end{aligned}$$

Let us remark, that this variational time discretization does not involve derivatives of the anisotropy. Nevertheless, as we will see below, differentiation is indispensable to set up a descent algorithm for this functional.

3 Finite element discretization in space

In this section we introduce a suitable space discretization based on piecewise linear finite elements. Here, we follow the guideline for finite elements on surfaces introduced by Dziuk [21]. Thus, we consider simplicial meshes $\mathcal{M}[X]$ — polygonal curves for $d = 1$ and triangular surfaces for $d = 2$ — as approximations of the d dimensional surfaces $\mathcal{M}[x]$. Thereby, X is a parametrization of the simplicial mesh $\mathcal{M}[X]$ which is uniquely described by a vector \bar{X} of vertex positions of the mesh. To clarify the notation we will always denote discrete quantities with upper case letters to distinguish them from the corresponding continuous quantities in lower case letters. Furthermore, a bar on top of a discrete function indicates the corresponding nodal vector, i.e. $\bar{X} = (\bar{X}_i)_{i \in I}$, where $\bar{X}_i = (X_i^1, \dots, X_i^m)$ is the coordinate vector of the i th vertex of the mesh and I denotes the index set of vertices. For $d = 1$ each element T of a polygonal curve is a line segment with nodes X_1 and X_2 (using local indices) and for $d = 2$ elements T of a triangulation are planar triangles with vertices X_0, X_1 , and X_2 and edge vectors $F_0 = X_2 - X_1$, $F_1 = X_0 - X_2$, and $F_2 = X_1 - X_0$.

Given a simplicial surface $\mathcal{M}[X]$ we denote by

$$\mathcal{V}(\mathcal{M}[X]) := \{U \in C^0(\mathcal{M}[X]) \mid U|_T \in \mathcal{P}_1 \forall T \in \mathcal{M}[X]\}$$

the associated piecewise affine finite element space. With a slight misuse of notation the mapping X itself is considered as an element in $\mathcal{V}(\mathcal{M}[X])^m$. Let $\{\Phi_i\}_{i \in I}$ be the nodal basis of $\mathcal{V}(\mathcal{M}[X])$. For $U \in \mathcal{V}(\mathcal{M}[X])$ we obtain $U = \sum_{i \in I} U(X_i)\Phi_i$ and $\bar{U} = (U(X_i))_{i \in I}$ —in agreement with our previous definition as we recover $\bar{X} = (X_i)_{i \in I}$.

Next, let us introduce the mass matrix $M[X]$ and the stiffness matrix $L[X]$ of the discrete surface $\mathcal{M}[X]$, whose entries are given by $M_{ij}[X] = \int_{\mathcal{M}[X]} \Phi_i \Phi_j \, da$ and $L_{ij}[X] = \int_{\mathcal{M}[X]} \nabla_{\mathcal{M}[X]} \Phi_i \cdot \nabla_{\mathcal{M}[X]} \Phi_j \, da$. The corresponding block structured matrices, which act in an identical way simultaneously on the m coordinates of a vector with m components for each node, are denoted by $\mathbf{M}[X]$ and $\mathbf{L}[X]$, respectively. As usual all matrices are assembled from corresponding local matrices computed on the simplices T of $\mathcal{M}[X]$.

3.1 Willmore flow of closed surfaces

Now, we have all the ingredients at hand to derive the fully discrete nested time discretization of Willmore flow, as the spatially discrete counterpart of (2.4) and (2.5):

Given an discrete initial surface $\mathcal{M}[X^0]$ with discrete parametrization X^0 we compute a sequence of surfaces $\mathcal{M}[X^k]$ with parametrizations X^k by solving the following nested finite dimensional variational problem:

$$X^{k+1} = \arg \min_{X \in \mathcal{V}(\mathcal{M}[X^k])^m} W[X^k, X, Y[X]], \quad \text{where} \quad (3.1)$$

$$Y[X] = \arg \min_{Y \in \mathcal{V}(\mathcal{M}[X])^m} E[X, Y]. \quad (3.2)$$

Here, the discrete functionals are given by

$$\begin{aligned} E[X, Y] &:= \int_{\mathcal{M}[X]} (Y - X)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[X]} Y|^2 \, da \\ &= \mathbf{M}[X](\bar{Y} - \bar{X}) \cdot (\bar{Y} - \bar{X}) + \tilde{\tau} \mathbf{L}[X] \bar{Y} \cdot \bar{Y}, \\ W[X^k, X, Y] &:= \int_{\mathcal{M}[X^k]} (X - X^k)^2 \, da + \frac{\tau}{\tilde{\tau}^2} \int_{\mathcal{M}[X]} (Y - X)^2 \, da \\ &= \mathbf{M}[X^k](\bar{X} - \bar{X}^k) \cdot (\bar{X} - \bar{X}^k) + \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X](\bar{Y} - \bar{X}) \cdot (\bar{Y} - \bar{X}) \end{aligned}$$

as straightforward spatially discrete counterpart of the functionals $e[x, y]$ and $w[x^k, x, y]$, respectively. Analogously to the spatially continuous case in (2.3), for a given X , the nodal vector $\bar{Y}[X]$ solves the linear system of equation

$$(\mathbf{M}[X] + \tilde{\tau} \mathbf{L}[X]) \bar{Y}[X] = \mathbf{M}[X] \bar{X}.$$

Appendix B provides explicit formulas for the entries of the mass and stiffness matrices.

3.2 Willmore flow with boundary conditions

In case of a discrete surface restoration application we consider a discrete simplicial surface $\widetilde{\mathcal{M}}[X]$ consisting of the actual surface patch $\mathcal{M}[X]$ — to be modified for instance in a surface restoration

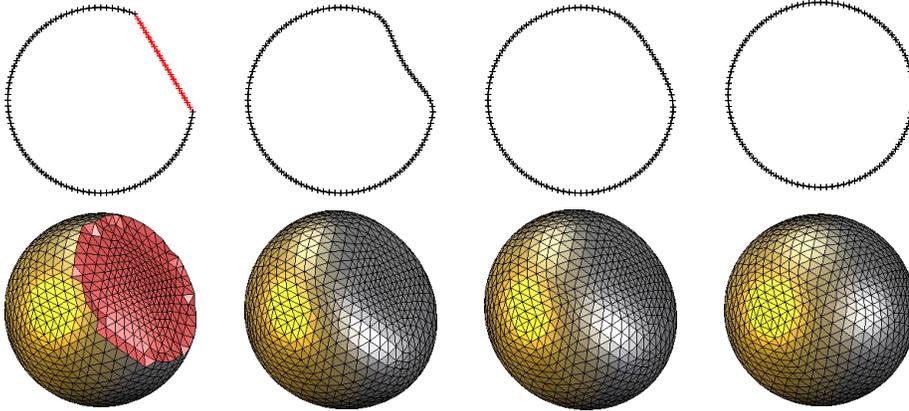


Figure 1: Discrete isotropic Willmore flow is applied to a curve segment and a surface patch (plotted in red on the left at the initial time) with boundary conditions for the position and the co-normal. From left to right the solution together with the underlying triangulation is shown at time 0.0, 0.02, 0.45, and 1.12, where the underlying sphere radius is 1 and we have applied the time step size $\tau = h = 0.02$.

application — and a polygonal ring $\mathcal{M}^{\text{ext}}[X]$ consisting of one layer of simplices around the discrete boundary $\Gamma[X] = \partial\mathcal{M}[x]$ on which X has a given fixed parametrization X^{ext} . We split the set of nodes \mathcal{N} of $\mathcal{M}[X]$ into the set of interior nodes \mathcal{N}^{int} of $\mathcal{M}[X]$, and boundary nodes \mathcal{N}^{∂} , and denote the corresponding index sets by I , I^{int} , and I^{∂} , respectively. Let us emphasize that the nodal vectors for functions in $\mathcal{V}_0(\widetilde{\mathcal{M}})$ and in $\mathcal{V}(\mathcal{M})$ can be identified because of the single layer assumption on $\mathcal{M}^{\text{ext}}[X]$. Furthermore, $\mathcal{V}^{\text{int}}(\mathcal{M}[X])$ denotes the subspace of $\mathcal{V}(\mathcal{M}[X])$ of functions vanishing on $\Gamma[X]$ and we introduce the obvious restriction operator $R : \mathbb{R}^{|I|} \rightarrow \mathbb{R}^{|I^{\text{int}}|}$ and a corresponding extension operators $E : \mathbb{R}^{|I^{\text{int}}|} \rightarrow \mathbb{R}^{|I|}$ with $(E\bar{U})_i = 0$ for $i \in I^{\partial}$. The corresponding block operators acting on nodal vectors are denoted by \mathbf{R} and \mathbf{E} , respectively. Hence, a valid nodal vector in $\mathbb{R}^{3|I|}$ can be written as $\mathbf{E}\bar{X} + \bar{X}^{\text{ext}}$, where \bar{X}^{ext} is the vector with prescribed vertex positions at boundary nodes and zero entries for all interior nodes.

To prescribe a discrete co-normal we proceed as follows. On simplicial faces of $\Gamma[X]$ we compute N^{co} as the (piecewise constant) co-normal lying in the plane of the boundary elements of $\mathcal{M}^{\text{ext}}[X]$ and define a corresponding (non unit length) nodal vector

$$\bar{N}^{\text{co}}[X] := \left(\int_{\partial\mathcal{M}[X]} N^{\text{co}} \Phi_i \, ds \right)_{i \in I}$$

in $\mathbb{R}^{d|I|}$. Then discrete counterpart $E^{\partial}[\cdot, \cdot]$ on $\mathcal{V}^{\text{int}}(\mathcal{M}[X^k]) \times \mathcal{V}(\mathcal{M}[X])$ of the functional $e^{\partial}[\cdot, \cdot]$ is

given by

$$\begin{aligned}
 E^\partial[X, Y] &:= \int_{\mathcal{M}[X]} (Y - X)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[X]} Y|^2 \, da - 2\tilde{\tau} \int_{\partial\mathcal{M}[X]} N^{co} \cdot Y \, ds \\
 &= \mathbf{M}[X] (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}) \cdot (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}) \\
 &\quad + \tilde{\tau} \mathbf{L}[X] \bar{Y} \cdot \bar{Y} - 2\tilde{\tau} \bar{N}^{co} \cdot \bar{Y},
 \end{aligned}$$

with $\bar{X} \in \mathbb{R}^{m\sharp I^{int}}$ and $\bar{X}^{ext}, \bar{Y} \in \mathbb{R}^{m|I}$, whereas the corresponding functional $W[X^k, \cdot, \cdot]$ on the finite element space $\mathcal{V}^{int}(\mathcal{M}[X^k]) \times \mathcal{V}(\mathcal{M}[X])$ can be rephrased as

$$\begin{aligned}
 W^\partial[X^k, X, Y] &:= \int_{\mathcal{M}[X^k]} (X - X^k)^2 \, da + \frac{\tau}{\tilde{\tau}^2} \int_{\mathcal{M}[X]} (Y - X)^2 \, da \\
 &= \mathbf{M}[X^k] (\mathbf{E}\bar{X} - \bar{X}^k) \cdot (\mathbf{E}\bar{X} - \bar{X}^k) \\
 &\quad + \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X] (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}) \cdot (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}).
 \end{aligned}$$

Hence, to compute $\bar{Y}[X]$ we have to solve the linear system of equation

$$(\mathbf{M}[X] + \tilde{\tau} \mathbf{L}[X]) \bar{Y}[X] = \mathbf{M}[X] (\mathbf{E}\bar{X} - \bar{X}^{ext}) + \tilde{\tau} \bar{N}^{co}.$$

In case of the alternative approach, one defines the discrete functional $\tilde{E}^\partial[\cdot, \cdot]$ on $\mathcal{V}^{int}(\mathcal{M}[X^k]) \times \mathcal{V}_0(\tilde{\mathcal{M}}[X])$ by

$$\begin{aligned}
 \tilde{E}^\partial[X, Y] &:= \int_{\tilde{\mathcal{M}}[X]} (Y - X)^2 + \tilde{\tau} |\nabla_{\mathcal{M}[X]} Y|^2 \, da \\
 &= \tilde{\mathbf{M}}[X] (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}) \cdot (\bar{Y} - \mathbf{E}\bar{X} - \bar{X}^{ext}) + \tilde{\tau} \tilde{\mathbf{L}}[X] \bar{Y} \cdot \bar{Y},
 \end{aligned}$$

where $\tilde{\mathbf{M}}[X]$ and $\tilde{\mathbf{L}}[X]$ are the block mass and stiffness matrices on $\mathcal{V}(\tilde{\mathcal{M}}[X])$. Hence, now the nodal vector $\bar{Y}[X]$ is still in $\mathbb{R}^{m|I}$ and solves

$$(\tilde{\mathbf{M}}[X] + \tilde{\tau} \tilde{\mathbf{L}}[X]) \bar{Y}[X] = \tilde{\mathbf{M}}[X] (\mathbf{E}\bar{X} - \bar{X}^{ext}).$$

3.3 Anisotropic Willmore flow of closed surfaces

The spatial discretization of the anisotropic Willmore flow of hypersurfaces is based on the discrete functional

$$\begin{aligned}
 E_\gamma[X, Y] &:= \int_{\mathcal{M}[X]} (Y - X)^2 \, da + 2\tilde{\tau} \int_{\mathcal{M}[Y]} \gamma(N[Y]) \, da \\
 &= \mathbf{M}[X] (\bar{Y} - \bar{X}) \cdot (\bar{Y} - \bar{X}) + 2\tilde{\tau} A_\gamma[Y],
 \end{aligned} \tag{3.3}$$

with $A_\gamma[Y] = \int_{\mathcal{M}[Y]} \gamma(N[Y]) \, da$ being the anisotropic area functional. Here, $\gamma(N[Y])$ is piecewise constant on $\mathcal{M}[Y]$ and thus can be integrated exactly. Furthermore, the functional $W[X^k, \cdot, \cdot]$ remains the same as in the isotropic case. Now, for fixed X the discrete Euler Lagrange equation with respect to Y is obviously nonlinear and we obtain that \bar{Y} solves

$$0 = \mathbf{M}[X](\bar{Y} - \bar{X}) + \bar{\tau} \text{grad } A_\gamma[\bar{Y}] \quad (3.4)$$

where the gradient is assembled via the evaluating of

$$\partial_Y A_\gamma[Y](\Theta) = \int_{\mathcal{M}[Y]} \gamma(N[Y]) \nabla_{\mathcal{M}[Y]} Y : \nabla_{\mathcal{M}[Y]} \Theta \, da - \int_{\mathcal{M}[Y]} \sum_{l=1}^{d+1} \gamma_z(N[Y]) \cdot \nabla_{\mathcal{M}[Y]} \Theta_l N_l[Y] \, da$$

for all basis functions $\Theta = \Phi_i e_j$. Here, $N[Y]$ is the piecewise constant normal field on $\mathcal{M}[Y]$ and the first integral on the right hand side represents the variation of the anisotropic area functional with respect to the integration domain taking into account the linearization argument from Appendix A. Furthermore, the second integral reflects the variation of the integrand making use of the observation

$$\frac{d}{d\epsilon} \gamma(N[Y + \epsilon\Theta])|_{\epsilon=0} = - \sum_{l=1}^{d+1} \gamma_z(N[Y]) \cdot \nabla_{\mathcal{M}[Y]} \Theta_l N_l[Y].$$

For a given X , equation (3.4) can be solved by a Newton method.

4 Optimization algorithm for the time steps

In Section 2 we have derived a variational time discretization for different Willmore flow models leading to a constrained optimization problem, where the constraint is associated with the approximation of the isotropic or anisotropic mean curvature via the time discrete speed of a corresponding curvature motion model. Through spatial discretization we formulated in Section 3 a finite dimensional constrained optimization problem to be solved in each time step of Willmore flow. Here, we now use classical duality techniques from optimization to solve the resulting time step problem efficiently. For a general overview on these techniques we refer to Nocedal & Wright [38] or [4, 27, 29].

4.1 Duality approach and gradient descent

To simplify the exposition we first restrict ourselves to the *isotropic Willmore flow model for closed surfaces*. Afterwards, we will generalize this approach for surfaces with boundaries and anisotropic Willmore flow. Slightly rephrasing (3.1) and (3.2) we aim at minimizing the functional

$$\widehat{W}[X] = W[X^k, X, Y[X]]$$

with $Y[X]$ being a solution of the inner minimization problem (3.2). A straightforward differentiation leads to

$$\partial_X \widehat{W}[X](\Theta) = \partial_X W[X^k, X, Y[X]](\Theta) + (\partial_Y W)[X^k, X, Y[X]](\partial_X Y[X](\Theta)).$$

Hence, computing the full gradient of \widehat{W} in this way requires the evaluation of $\partial_X Y[X](\Phi_i e_j)$ for every finite element basis function Φ_i and any canonical basis vector e_j in \mathbb{R}^m . To derive a computational efficient representation of the gradient as an essential ingredient of any descent algorithm, we apply the following duality argument. From the optimality of $Y[X]$ in the inner problem, we deduce the equation $0 = \partial_Y E[X, Y[X]](\Psi)$ for any test function $\Psi \in \mathcal{V}(\mathcal{M}[X])^m$. Differentiating with respect to X we obtain

$$\begin{aligned} 0 &= \partial_X (\partial_Y E[X, Y[X]](\Psi))(\Theta) \\ &= \partial_X \partial_Y E[X, Y](\Psi, \Theta) + \partial_Y^2 E[X, Y[X]](\Psi, \partial_X Y[X](\Theta)). \end{aligned} \quad (4.1)$$

Now, one defines $P \in \mathcal{V}(\mathcal{M}[X^k])^m$ as the solution of the dual problem

$$\partial_Y^2 E[X, Y[X]](P, \Psi) = \partial_Y W[X^k, X, Y[X]](\Psi). \quad (4.2)$$

for all test functions $\Psi \in \mathcal{V}(\mathcal{M}[X^k])^m$. Choosing $\Psi = \partial_X Y[X](\Theta)$ in (4.2) and $\Psi = P$ in (4.1) yields

$$(\partial_Y W)[X^k, X, Y[X]](\partial_X Y[X](\Theta)) = -\partial_X \partial_Y E[X, Y](P, \Theta).$$

Thus, we can finally rewrite the variation of \widehat{W} as

$$\partial_X \widehat{W}[X](\Theta) = \partial_X W[X^k, X, Y[X]](\Theta) - \partial_X \partial_Y E[X, Y](P, \Theta). \quad (4.3)$$

In the case of our basic Willmore flow model (3.1) and (3.2) the solution P of the dual problem (4.2) requires to solve the linear system of equations

$$(\mathbf{M}[X] + \tilde{\tau} \mathbf{L}[X]) \bar{P} = \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X](\bar{Y} - \bar{X}).$$

Furthermore, the terms on the right hand side of (4.3) are evaluated as follows

$$\begin{aligned} (\partial_X W)[X^k, X, Y](\Theta) &= 2 \mathbf{M}[X^k](\bar{X} - \bar{X}^k) \cdot \bar{\Theta} + 2 \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X](\bar{X} - \bar{Y}) \cdot \bar{\Theta} \\ &\quad + \frac{\tau}{\tilde{\tau}^2} (\partial_X \mathbf{M}[X](\Theta))(\bar{Y} - \bar{X}) \cdot (\bar{Y} - \bar{X}), \end{aligned} \quad (4.4)$$

$$\begin{aligned} \partial_X \partial_Y E[X, Y](P, \Theta) &= 2(\partial_X \mathbf{M}[X](\Theta))(\bar{Y} - \bar{X}) \cdot \bar{P} - 2 \mathbf{M}[X] \bar{\Theta} \cdot \bar{P} \\ &\quad + 2 \tilde{\tau} (\partial_X \mathbf{L}[X](\Theta)) \bar{Y} \cdot \bar{P}. \end{aligned} \quad (4.5)$$

Hence, we need to compute the variation $\partial_X \mathbf{M}[X](\Theta)$ and $\partial_X \mathbf{L}[X](\Theta)$ of the block matrices \mathbf{M} and \mathbf{L} , respectively, where Θ represents a variation of the simplicial mesh. The variation of these

block matrices composes of diagonal blocks of the variations of the corresponding matrices from the scalar case defined as $\partial_X M[X](\Theta) = \frac{d}{d\epsilon} M[X + \epsilon \Theta]|_{\epsilon=0}$ and $\partial_X L[X](\Theta) = \frac{d}{d\epsilon} L[X + \epsilon \Theta]|_{\epsilon=0}$. They are computed using a standard finite element assembly. We refer to Appendix B for the actual differentiation of the corresponding local matrix entries. With these ingredients at hand we can finally compute the descent direction in $\mathbb{R}^{m|I|}$ of the energy \widehat{W} for a given simplicity mesh $\mathcal{M}[X]$ described by the nodal vector \bar{X} to obtain

$$\text{grad}_X \widehat{W}[X] = \left(\partial_X \widehat{W}[X](\Phi_r e_s) \right)_{r \in I, s=1, \dots, m},$$

where e_s denotes the s th coordinate direction in \mathbb{R}^m .

With this gradient evaluation at hand we can already apply a gradient descent scheme with the Amijo step size control, choosing as initial data the nodal vector \bar{X}^k from the previous time step.

In the case of *Willmore flow with boundary conditions*, we investigate the functional $\widehat{W}^\partial[X] := W^\partial[X^k, X, Y[X]]$. Using the same duality argument P solves

$$(\mathbf{M}[X] + \tilde{\tau} \mathbf{L}[X]) \bar{P} = \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X] (\bar{Y} - \mathbf{E} \bar{X} - \bar{X}^{ext}),$$

or in the alternative approach

$$\left(\widetilde{\mathbf{M}}[X] + \tilde{\tau} \widetilde{\mathbf{L}}[X] \right) \bar{P} = \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X] (\bar{Y} - \mathbf{E} \bar{X} - \bar{X}^{ext}).$$

Furthermore, in this case given $\partial_X \widehat{W}^\partial[X](\Theta) = \partial_X W^\partial[X^k, X, Y[X]](\Theta) - \partial_X \partial_Y E^\partial[X, Y](P, \Theta)$ the gradient components on the right hand side are evaluated as follows

$$\begin{aligned} \partial_X W^\partial[X^k, X, Y](\Theta) &= 2 \mathbf{M}[X^k] (\mathbf{E} \bar{X} - \bar{X}^k) \cdot \mathbf{E} \bar{\Theta} + 2 \frac{\tau}{\tilde{\tau}^2} \mathbf{M}[X] (\mathbf{E} \bar{X} + \bar{X}^{ext} - \bar{Y}) \cdot \mathbf{E} \bar{\Theta} \\ &\quad + \frac{\tau}{\tilde{\tau}^2} (\partial_X \mathbf{M}[X](\Theta)) (\bar{Y} - \mathbf{E} \bar{X} - \bar{X}^{ext}) \cdot (\bar{Y} - \mathbf{E} \bar{X} - \bar{X}^{ext}), \\ \partial_X \partial_Y E^\partial[X, Y](P, \Theta) &= 2 (\partial_X \mathbf{M}[X](\Theta)) (\bar{Y} - \mathbf{E} \bar{X} - \bar{X}^{ext}) \cdot \bar{P} - 2 \mathbf{M}[X] \mathbf{E} \bar{\Theta} \cdot \bar{P} \\ &\quad + 2 \tilde{\tau} (\partial_X \mathbf{L}[X](\Theta)) \bar{Y} \cdot \bar{P}, \end{aligned}$$

whereas in the alternative approach the mass matrix $\mathbf{M}[X]$ and the stiffness matrix $\mathbf{L}[X]$ are replaced by $\widetilde{\mathbf{M}}[X]$ and $\widetilde{\mathbf{L}}[X]$, respectively.

Let us finally investigate *the fully nonlinear, anisotropic model*. Now, the dual solution P solves the

$$(\mathbf{M}[x] + \tilde{\tau} \text{Hess } A_\gamma(Y)) \bar{P} = \frac{\tau}{\tilde{\tau}} \mathbf{M}[X] (\bar{Y} - \bar{X}).$$

Here, as in the gradient case, the Hessian is assembled via evaluation of $\partial_Y^2 A_\gamma[Y](\Phi_i e_j, \Phi_k e_l)$ for all vector valued basis functions $\Phi_i e_j$ and $\Phi_k e_l$, respectively. In the Appendix C we give formulas for the computation of the local entries $\text{Hess } A_\gamma[Y]$ on single elements in the case of polygonal curves ($d = 1$ and $m = 2$). Finally, for the second term in the gradient formula $\partial_X \widehat{W}^\partial[X](\Theta) = \partial_X W^\partial[X^k, X, Y[X]](\Theta) - \partial_X \partial_Y E_\gamma[X, Y](P, \Theta)$ we obtain

$$\partial_X \partial_Y E_\gamma[X, Y](P, \Theta) = 2 (\partial_X \mathbf{M}[X](\Theta)) (\bar{Y} - \bar{X}) \cdot \bar{P} - 2 \mathbf{M}[X] \bar{\Theta} \cdot \bar{P}.$$

4.2 Lagrangian and SQP method

A more efficient strategy to solve the constrained optimization problem in each time step is to apply a Newton method for the corresponding Lagrangian, which can also be phrased as a *sequential quadratic programming (SQP) approach*. For an introduction to the SQP method and the basic convergence theory we refer to Nocedal & Wright [38]. In our context we consider the following Lagrangian function for problem (3.1), (3.2)

$$L[\bar{X}, \bar{Y}, \bar{P}] = W[X^k, X, Y] - \partial_Y E[X, Y](P)$$

for the now independent unknowns $\bar{X}, \bar{Y} \in \mathbb{R}^{m|I|}$ and the Lagrange multiplier $\bar{P} \in \mathbb{R}^{m|I|}$. Here, with a slight misuse of notation, we either use a finite element function notation with Z in $\mathcal{V}(\mathcal{M}[X^k])^m$ and $\mathcal{V}(\mathcal{M}[X])^m$, respectively, or the corresponding nodal vector notation with $\bar{Z} \in \mathbb{R}^{m|I|}$. Now, we ask for critical points $(\bar{X}, \bar{Y}, \bar{P})$ of L . Indeed, $0 = \partial_{\bar{P}} L[\bar{X}, \bar{Y}, \bar{P}](\bar{\Theta}) = \partial_Y E[X, Y](\bar{\Theta})$ is the Euler Lagrange equation of the inner minimization problem with respect to \bar{Y} for given X and $0 = \partial_{\bar{Y}} L[\bar{X}, \bar{Y}, \bar{P}](\bar{\Theta}) = \partial_Y W[X^k, X, Y](\bar{\Theta}) - \partial_Y^2 E[X, Y](P, \bar{\Theta})$ is the defining equation for the dual solution P given Y as the solution of the above Euler Lagrange equation. Finally, $0 = \partial_{\bar{X}} L[\bar{X}, \bar{Y}, \bar{P}](\bar{\Theta}) = \partial_X W(X^k, X, Y)(\bar{\Theta}) - \partial_X \partial_Y E[X, Y](P, \bar{\Theta}) = \partial_X \widehat{W}(X)$ coincides with the Euler Lagrange equation for the actual constraint optimization problem. The Hessian of L , which is required to implement a Newton scheme, is given (in abbreviated form) by

$$\text{Hess } L = \begin{pmatrix} \partial_X^2 W - \partial_X^2 \partial_Y E(P) & \partial_X \partial_Y W - \partial_X \partial_Y^2 E(P) & -\partial_X \partial_Y E \\ \partial_X \partial_Y W - \partial_X \partial_Y^2 E(P) & \partial_Y^2 W - \partial_Y^3 E(P) & -\partial_Y^2 E \\ -\partial_X \partial_Y E & -\partial_Y^2 E & 0 \end{pmatrix}.$$

By a straightforward Lagrangian multiplier argument a Newton step coincides with the solution of the quadratic program

$$\left(\frac{1}{2} \text{Hess}_{(\bar{X}, \bar{Y})} L[\bar{X}^{k,l}, \bar{Y}^{k,l}, \bar{P}^{k,l}](\Delta \bar{X}, \Delta \bar{Y}) + \text{grad}_{(\bar{X}, \bar{Y})} W[\bar{X}^{k,l}, \bar{Y}^{k,l}] \right) \cdot (\Delta \bar{X}, \Delta \bar{Y}) \rightarrow \min$$

subject to the linearized constraint $\partial_{\bar{Y}} E[\bar{X}^{k,l}, \bar{Y}^{k,l}] + \text{grad}_{(\bar{X}, \bar{Y})} \partial_{\bar{Y}} E[\bar{X}^{k,l}, \bar{Y}^{k,l}] \cdot (\Delta \bar{X}, \Delta \bar{Y}) = 0$, where the index l indicates the l th Newton step with $\bar{X}^{k,l+1} = \bar{X}^{k,l} + \Delta \bar{X}$, $\bar{Y}^{k,l+1} = \bar{Y}^{k,l} + \Delta \bar{Y}$ and $\bar{P}^{k,l+1}$ appears as the Lagrangian multiplier with respect to the linear constraint.

For the Willmore flow of closed surfaces leading to the optimization problem (3.1), (3.2) the different terms in Hess L are evaluated as follows:

$$\begin{aligned} \partial_X^2 W(\Theta, \Psi) &= 2(\mathbf{M}[X^k] + \frac{\tau}{\bar{\tau}^2} \mathbf{M}[X]) \bar{\Psi} \cdot \bar{\Theta} + \frac{\tau}{\bar{\tau}^2} (\partial_X^2 \mathbf{M}[X](\Theta, \Psi)(\bar{Y} - \bar{X}) \cdot (\bar{Y} - \bar{X}) \\ &\quad + 2\partial_X \mathbf{M}[X](\Theta)(\bar{X} - \bar{Y}) \cdot \bar{\Psi} + 2\partial_X \mathbf{M}[X](\Psi)(\bar{X} - \bar{Y}) \cdot \bar{\Theta}), \\ \partial_X \partial_Y W(\Theta, \Psi) &= 2\frac{\tau}{\bar{\tau}^2} (\partial_X \mathbf{M}[X](\Psi)(\bar{Y} - \bar{X}) \cdot \bar{\Theta} - \mathbf{M}[X] \bar{\Theta} \cdot \bar{\Psi}), \\ \partial_Y^2 W(\Theta, \Psi) &= 2\frac{\tau}{\bar{\tau}^2} \mathbf{M}[X] \bar{\Theta} \cdot \bar{\Psi}, \end{aligned}$$

$$\begin{aligned}
\partial_X^2 \partial_Y E(\Theta, \Psi, \Xi) &= 2(\partial_X^2 \mathbf{M}[X](\Psi, \Xi)(\bar{Y} - \bar{X}) \cdot \bar{\Theta} - \partial_X \mathbf{M}[X](\Psi) \bar{\Theta} \cdot \bar{\Xi} \\
&\quad - \partial_X \mathbf{M}[X](\Xi) \bar{\Psi} \cdot \bar{\Theta} + \tilde{\tau} \partial_X^2 \mathbf{L}[X](\Psi, \Xi) \bar{Y} \cdot \bar{\Theta}), \\
\partial_X \partial_Y^2 E(\Theta, \Psi, \Xi) &= 2(\partial_X \mathbf{M}[X](\Xi) + \tilde{\tau} \partial_X \mathbf{L}[X](\Xi)) \bar{\Theta} \cdot \bar{\Psi}, \\
\partial_X \partial_Y E(\Theta, \Psi) &= 2(\partial_X \mathbf{M}[X](\Psi)(\bar{Y} - \bar{X}) \cdot \bar{\Theta} \\
&\quad - \mathbf{M}[X] \bar{\Psi} \cdot \bar{\Theta} + \tilde{\tau} \partial_X \mathbf{L}[X](\Psi) \bar{Y} \cdot \bar{\Theta}), \\
\partial_Y^3 E &= 0, \\
\partial_Y^2 E(\Theta, \Psi) &= 2(\mathbf{M}[X] + \tilde{\tau} \mathbf{L}[X]) \bar{\Theta} \cdot \bar{\Psi},
\end{aligned}$$

where $\partial_X \partial_Y E$ has already been given in (4.5). The different subblocks of the block structured Hessian $\text{Hess } L$ are again assembled in the usual way from local contribution on single elements of the polygonal mesh. Detailed formulas for the local derivatives are given in Appendix B.

The adaptation in the case of Willmore flow with boundary conditions is obvious, whereas for anisotropic Willmore flow we obtain for the derivatives of the energy E_γ from (3.3) appearing in $\text{Hess } L$

$$\begin{aligned}
\partial_X^2 \partial_Y E_\gamma(\Theta, \Psi, \Xi) &= 2(\partial_X^2 \mathbf{M}[X](\Psi, \Xi)(\bar{Y} - \bar{X}) \cdot \bar{\Theta} \\
&\quad - \partial_X \mathbf{M}[X](\Psi) \bar{\Xi} \cdot \bar{\Theta} - \partial_X \mathbf{M}[X](\Xi) \bar{\Psi} \cdot \bar{\Theta}) \\
\partial_X \partial_Y^2 E_\gamma(\Theta, \Psi, \Xi) &= 2 \partial_X \mathbf{M}[X](\Xi) \bar{\Psi} \cdot \bar{\Theta} \\
\partial_X \partial_Y E_\gamma(\Theta, \Psi) &= 2(\partial_X \mathbf{M}[X](\Psi)(\bar{Y} - \bar{X}) \cdot \bar{\Theta} - \mathbf{M}[X] \bar{\Psi} \cdot \bar{\Theta}) \\
\partial_Y^3 E_\gamma(\Theta, \Psi, \Xi) &= 2 \tilde{\tau} \partial_Y \text{Hess } A_\gamma[Y](\Xi) \bar{\Psi} \cdot \bar{\Theta} \\
\partial_Y^2 E_\gamma(\Theta, \Psi) &= 2(\mathbf{M}[X] + \tilde{\tau} \text{Hess } A_\gamma[Y]) \bar{\Psi} \cdot \bar{\Theta}
\end{aligned}$$

For the (now necessary) third derivatives of the local anisotropic area functional A_γ we refer to Appendix C.

5 Numerical results

We have applied our numerical algorithm for Willmore flow to the evolution of curves in \mathbb{R}^2 and in \mathbb{R}^3 , and to two dimensional surfaces in \mathbb{R}^3 . We study curve and surface blending problems and investigate the numerical solution of anisotropic Willmore of curves. A particular emphasis is on the robustness and stability of the proposed approach in particular for large time steps τ up to the order the spatial grid size h .

5.1 Willmore flow of closed curves and surfaces

At first, we numerical solve the Willmore flow problem for curves in 2D and simulate the evolution of circles, where the explicit solution has already been discussed in Section 2.1. The continuous and discrete evolution is compared in Fig. 2 and an experimental study of convergence in the L^2 norm

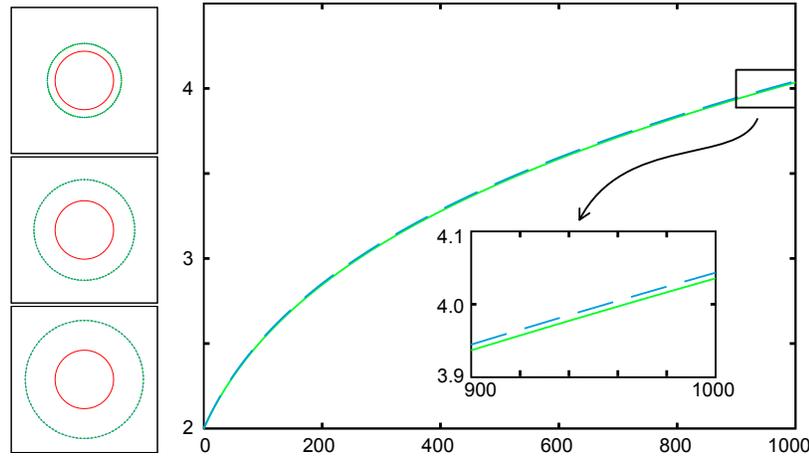


Figure 2: The evolution of a circle under Willmore flow is displayed. On the left, the initial circle of radius $R(0) = 2$ (red) and the discrete solution (green) are plotted at times $t = 0.01, 0.05, 0.1$. The computation is based on a polygonal approximation with 200 vertices and $\tau = \tilde{\tau} = h$. Furthermore on the right, the evolution of the average radius (green) is compared with the radius of the exact solution (blue) over time.

is presented in Table 1 in agreement with the consistency error of our model $O(h^2 + \tau + \tilde{\tau})$. For the actual numerical solution of the discrete variational problem to be solved at each time step we have used the Newton scheme for the Lagrangian.

Furthermore, we investigate spheres in \mathbb{R}^3 , which are known to be stationary solutions of Willmore flow. The Willmore energy is invariant with respect to Möbius transformation. These invariants might lead to degeneracies of the numerical grid in long time simulations as observed for the semi-implicit algorithm of Rusu [47]. On the same time scale and with the same underlying time step size the nested time discretization turned out to be more robust as depicted in Fig. 3. Even for significantly larger times the new scheme remains stable.

n	L^2 error ($\tau = \tilde{\tau} = h^2$)	L^2 error ($\tau = \tilde{\tau} = h$)
4	0.1255	0.1632
5	0.0425	0.0697
6	0.0098	0.0294
7	0.0032	0.0137
8	0.0006	0.0057

Table 1: The L^2 error between the exact solution $R(t)$ for $t = 0.01$ and the corresponding discrete radius function $R_h(X^k) := |X^k|$ with $\tau = \frac{t}{k}$ is computed on $\mathcal{M}[X^k]$, where $\tau = \tilde{\tau} = h^2$ (left column) and $\tau = \tilde{\tau} = h$ (right column) for a varying grid size h resulting from a initial polygon $\mathcal{M}[X^0]$ with 2^n edges of equal length with $n = 4, 5, 6, 7, 8$.

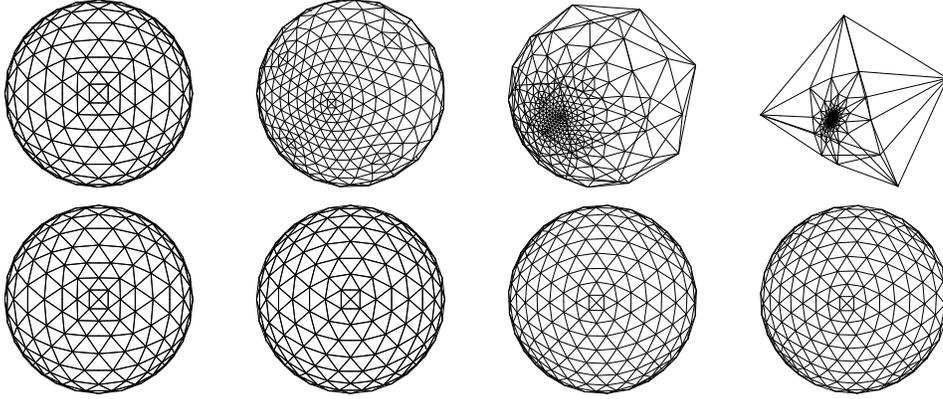


Figure 3: Results of the semi-implicit scheme [47] (top row) are compared with the proposed algorithm using a Newton method (bottom row). The mesh size of the discrete spheres is $h = 0.02$, and as time step size we consider $\tau = 16 \cdot 10^{-8}$ in both methods ($\tilde{\tau} = \tau$ in the our scheme). From left to right the triangulations are rendered at times $t = 0.0, t = 2381.9, t = 2442.2, t = 2472.4$.

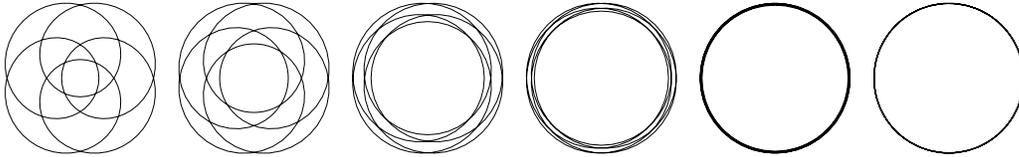


Figure 4: The evolution of a planar hypocycloid towards a fivefold covering of a circle is shown at times $t = 0.0, t = 685.7, t = 2987.4, t = 4850.1, t = 7965.8, t = 10630.6$. The curves are graphically rescaled to have similar size. The computational parameters were $\lambda = 0.025$, and $\tau = h = 0.5493$ and a gradient descent method was used.

Next, we consider an example already proposed by Dziuk and Deckelnick in [15], where a hypocycloid is considered as initial data. Here, the parametrization of the initial curve is given by $X_0(t) = (-\frac{5}{2} \cos(t) + 4 \cos(5t), -\frac{5}{2} \sin(t) + 4 \sin(5t), \delta \sin(3t))$. In \mathbb{R}^2 for $\delta = 0$ the initial curve evolves to a fivefold covering of a circle (cf. Figure 4) since multiple coverings of a circle are stable stationary solutions in the codimension one case [43]. This is not true in the case of higher codimension for $m \geq 3$. If we start with an initial curve slightly perturbed in vertical direction, we have chosen $\delta = 0.1$, the curve begins to unfold and evolves to a single circle (cf. Figure 5). Here, we use a gradient descent method to solve the optimization problem for each time step.

Furthermore, we depict in Figure 6 the evolution of a coarse polygonal approximation of a torus towards the Clifford torus $\mathcal{M} = \{x \in \mathbb{R}^3 | (1 - \sqrt{x_1^2 + x_2^2})^2 + x_3^2 = \frac{1}{2}\}$. In Figure 7 we compare the discrete evolution at a fixed time for different choices of the time step τ ($\tilde{\tau} = \tau$).

5.2 Curve and surface blending

Figure 8 shows different solutions of a curve blending problem. The Willmore energy for a circular segment with an opening angle α and radius r is given by $\frac{\alpha}{r}$. Thus, for two given curve segments

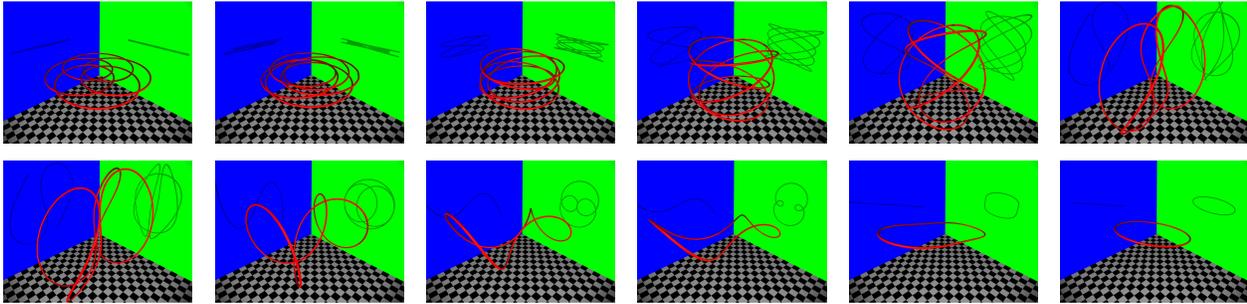


Figure 5: The evolution of a vertically perturbed hypocycloid towards a circle under Willmore flow with $\delta = 0.1$, $h = 0.005$ at $t = 0$, and $\tau = 0.005$ is shown at times $t = 0.0$, $t = 1348.9$, $t = 4467.1$, $t = 5511.4$, $t = 6555.7$, $t = 7406.6$, $t = 8257.2$, $t = 9108.4$, $t = 9297.0$, $t = 9361.3$, $t = 9426.8$, $t = 9489.1$.

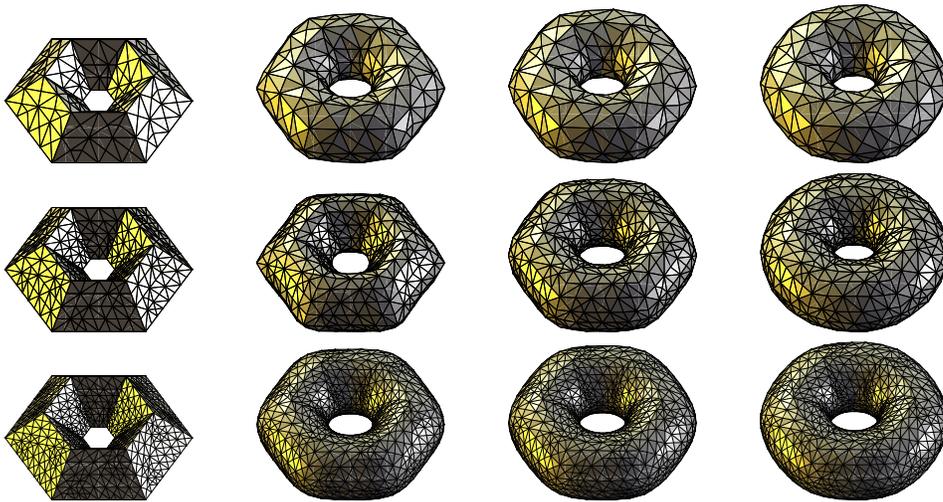


Figure 6: Different Willmore flow time steps are depicted from the evolution of a coarse polygonal torus model towards the Clifford torus. The Newton scheme for the Lagrangian is applied, where $h = 0.0977$ (1st row), $h = 0.0745$ (2nd row), and $h = 0.0089$ (3rd row), respectively. From left to right the surfaces are rendered at times $t = 0.0$, $t = 0.09$, $t = 0.15$, and $t = 0.97$.

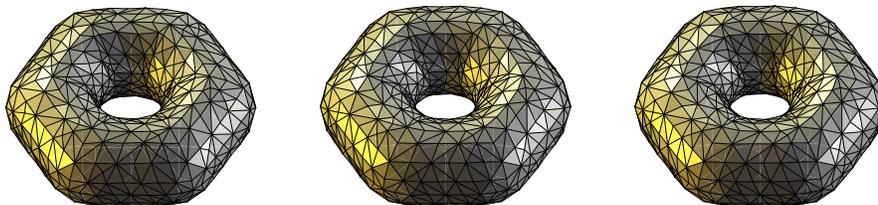


Figure 7: For the Willmore flow evolution in Figure 6) we render the triangulated discrete surfaces at time $t = 0.3735$ resulting from computations with different time step sizes $\tau = h^4$, $\tau = h^2$, and $\tau = h$, where the initial grid size is $h = 0.0745$.

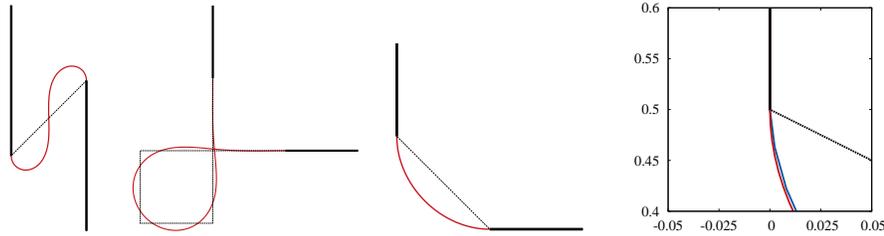


Figure 8: Discrete stationary solutions of different curve blending problem are shown. Here, $\tau = h = 0.01386$, $\tilde{\tau} = 1.386 \cdot 10^{-5}$, and $\lambda = 1.0$. The initial curve is plotted as a dotted line. On the right we compare the scheme with prescribed co-normal N^{co} (red) and the alternative approach with an additional ring of triangles (blue) in an enlargement of the previous plot.

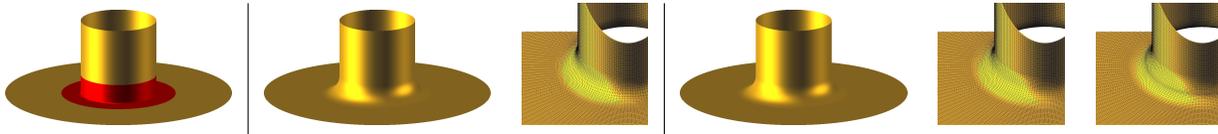


Figure 9: For the solution of a surface blending problem with a blending region marked in red (left) we compare the semi-implicit scheme from [13] (middle block) and the new method using a SQP approach (right block) with a blow-up zoomed view onto the corresponding triangulation. Here, the (almost stationary) solution is rendered at time $t = 1.4$ and the computational parameters are $h = \tau = 0.14$, $\tilde{\tau} = 0.002$ (first blow-up in on the right) and $\tau = \tilde{\tau} = 0.0004$ (second blow-up on the right).

which have to be blended we can continue these segments by straight line segments and connect them by such a circular arc. As the length of the straight line segments tends to infinity the Willmore energy of the whole blending construction tends to zero. To avoid this modeling artifact we consider a slight generalization of the above Willmore flow model. We add $\lambda a[x]$ to the Willmore energy, where λ is a fixed constant and $a[x]$ denotes the length of the curve. Here, λ can be regarded as a Lagrangian multiplier with respect to a length constraint. Hence, for proper choices of λ the generalized model avoids expansion. If X represents a discrete closed curve as above, we obtain for the discrete length functional $A[X] = \sum_{i \in I} Q_i$. Furthermore, its gradient vector in $\mathbb{R}^{m|I|}$ is given by $\overline{\text{grad}}_X A[X] = L[X] \bar{X}$. Figure 9 shows a blending surface generated by the proposed method and a comparison with the restoration method by Clarenz et al. [13] based on the semi-implicit discretization of Willmore flow.

In curve and surface restoration the two variants of our approach give very similar results and differ only slightly in the corresponding parameterization. The second variant appears to more natural for surface restoration with a given outer triangular mesh, whereas the first variation is more suitable for blending problems with explicitly given co-normal.

Finally, in Figure 10 we address further blending and surface restoration problems using the second variant of our method. For a comparison with the semi-implicit approach and a discrete geometry approach we refer to Clarenz et al. [13] and Bobenko & Schröder [7], respectively.

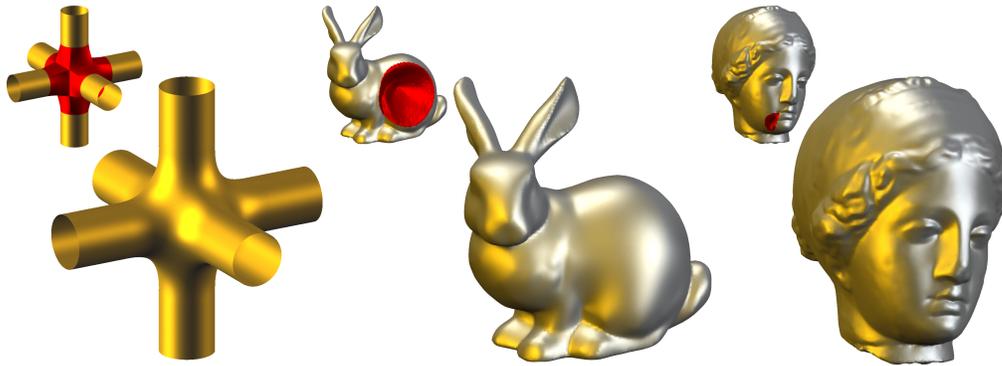


Figure 10: Results of the second variant of the new method for Willmore flow are shown for a higher genus blending problem and two different surface restoration applications using the SQP approach.

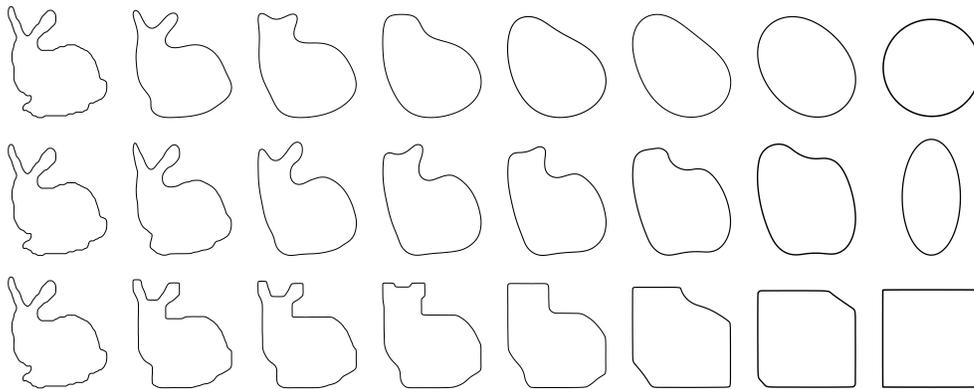


Figure 11: Different time steps of the evolution of a bunny shape with 436 nodes towards a circle (first row), an ellipse (second row) In all three cases we have chosen $\tau = h = 0.00865$ (h being the initial grid size), $\lambda = 0.025$, and $\tilde{\tau} = 7.5 \cdot 10^{-5}$.

5.3 Simulation of anisotropic Willmore flow of curves

We have implemented our numerical algorithm for the anisotropic Willmore flow of polygonal curves in \mathbb{R}^2 . Here, we present results for three different types of Wulff shapes and corresponding anisotropies $\gamma_0(z) = |z|$, $\gamma_1(z) = \sqrt{z_1^2 + 4z_2^2}$, and $\gamma_2(z) = \sum_{l=1}^2 \sqrt{10^{-7}|z|^2 + z_l^2}$ for $z = (z_1, z_2) \in \mathbb{R}^2$. In addition, we take into account a length energy as in Section 5.2. The results underline that time steps up to the order the spatial grid size h are feasible also in the anisotropic case. Figure 11 shows the evolution of a bunny shaped model towards a circle, an ellipse and a square with slightly rounded corners. We used the Newton method for the Lagrangian to solve the optimization problem at each time step.

Appendix

A. Linearization of surface area

Here, we show that for two d -dimensional surfaces $\mathcal{M}[x]$ and $\mathcal{M}[y]$ in \mathbb{R}^m with smooth parametrizations x and y which are close in C^1 , the approximation result (2.1) holds. To see this, let us consider x and y as two charts defined on a parameter domain $\omega \subset \mathbb{R}^d$ of $\mathcal{M}[x]$ and $\mathcal{M}[y]$, respectively. Then, $\int_{y(\omega)} da = \int_{\omega} \sqrt{\det(Dy^T Dy)} d\xi$. Taking into account that $\frac{d}{ds} \sqrt{d(1+s)}|_{s=0} = \frac{1}{2} \sqrt{d}$ and using Taylor expansion we obtain

$$\begin{aligned} \sqrt{\det(Dy^T Dy)} &= \sqrt{\det(Dx^T Dx) \det(\mathbb{I} + (Dx^T Dx)^{-1}(Dy^T Dy - Dx^T Dx))} \\ &= \sqrt{\det(Dx^T Dx)} \left(1 + \frac{\text{tr}((Dx^T Dx)^{-1}(Dy^T Dy - Dx^T Dx))}{2} \right) + O(\|y-x\|_{C^1}^2) \\ &= \sqrt{\det(Dx^T Dx)} \left(1 - \frac{d}{2} + \frac{1}{2} \text{tr}(Dy(Dx^T Dx)^{-1}Dy^T) \right) + O(\|y-x\|_{C^1}^2). \end{aligned}$$

Hence, we get

$$\begin{aligned} \int_{\omega} \sqrt{\det(Dy^T Dy)} d\xi &= \left(1 - \frac{d}{2} \right) \int_{\omega} \sqrt{\det(Dx^T Dx)} d\xi \\ &\quad + \frac{1}{2} \int_{\omega} \text{tr}(Dy(Dx^T Dx)^{-1}Dy^T) \sqrt{\det(Dx^T Dx)} d\xi \\ &\quad + O(\|y-x\|_{C^1}^2), \end{aligned}$$

which together with the observation $|\nabla_{\mathcal{M}[x]} y|^2 = \text{tr}(Dy(Dx^T Dx)^{-1}Dy^T)$ finally proves our claim.

B. Local finite element matrices and their derivatives

Here, we derive formulas for the derivatives of the local mass and stiffness matrices. For simplicity we assume that we deal only with a single d dimensional, non degenerate simplex T with vertices X_0, \dots, X_d in \mathbb{R}^m . Then, the mass and stiffness matrix are given by

$$M[X] = \sqrt{\det G[X]} \hat{M}, \quad L[X] = \frac{1}{d!} \sqrt{\det G[X]} \left(G[x]^{-1} \hat{\nabla} \hat{\Phi}_i \cdot \hat{\nabla} \hat{\Phi}_j \right)_{i,j=0,\dots,d}.$$

Here, \hat{M} is the usual mass matrix on the reference simplex \hat{T} in \mathbb{R}^d with vertices 0 and e_1, \dots, e_d . Furthermore, $\hat{\Phi}_k$ ($k = 0, \dots, d$) are the corresponding basis function on \hat{T} and the gradient of $\hat{\Phi}_k$ is given by $\hat{\nabla} \hat{\Phi}_k = \left((1 - \delta_{k0}) \delta_{kj} - \delta_{k0} d^{-\frac{1}{2}} \right)_{j=1,\dots,d}$. Furthermore, $G[X] = DX^T DX$ is the (discrete) metric tensor, where X is the mapping from the reference simplex \hat{T} to the simplex T . For the derivatives of the metric tensor we obtain

$$\begin{aligned} \partial_{X_k} G[X](V) &= (\partial_{X_k} DX(V))^T DX + DX (\partial_{X_k} DX(V))^T \\ \partial_{X_l} \partial_{X_k} G[X](V, W) &= (\partial_{X_l} DX(W))^T (\partial_{X_k} DX(V)) + (\partial_{X_k} DX(V))^T (\partial_{X_l} DX(W)) \end{aligned}$$

for $V, W \in \mathbb{R}^m$, where $\partial_{X_k} DX(V) = (((1 - \delta_{k0})\delta_{kj} - \delta_{k0})V_i)_{\substack{i=1,\dots,m \\ j=1,\dots,d}}$ is the derivative of the Jacobian of X with respect to the position of the vertex X_k . From this we immediately deduce

$$\begin{aligned} \partial_{X_k} \sqrt{\det G[x]} &= \frac{1}{2} \sqrt{\det G[x]} \operatorname{tr}(G[X]^{-1} \partial_{X_k} G[X](V)), \\ \partial_{X_k} (G[x]^{-1})(V) &= -G[x]^{-1} \partial_{X_k} G[X](V) G[x]^{-1}, \\ \partial_{X_l} \partial_{X_k} (G[x]^{-1})(V, W) &= -G[x]^{-1} \partial_{X_l} \partial_{X_k} G[X](V, W) G[x]^{-1} \\ &\quad + G[x]^{-1} \partial_{X_l} G[X](W) G[x]^{-1} \partial_{X_k} G[X](V) G[x]^{-1} \\ &\quad + G[x]^{-1} \partial_{X_k} G[X](V) G[x]^{-1} \partial_{X_l} G[X](W) G[x]^{-1}, \\ \partial_{X_l} \partial_{X_k} \sqrt{\det G[x]}(V, W) &= \frac{1}{4} \sqrt{\det G[x]} \operatorname{tr}(G[X]^{-1} \partial_{X_l} G[X](W)) \\ &\quad \cdot \operatorname{tr}(G[X]^{-1} \partial_{X_k} G[X](V)) + \\ &\quad \frac{1}{2} \sqrt{\det G[x]} \operatorname{tr}(\partial_{X_l} (G[x]^{-1})(W) \partial_{X_k} G[X](V) \\ &\quad + G[X]^{-1} \partial_{X_l} \partial_{X_k} G[X](V, W)). \end{aligned}$$

Finally, we get the following formulas for the derivative of the mass and stiffness matrix

$$\begin{aligned} \partial_{X_k} M[X](V) &= \partial_{X_k} \sqrt{\det G[x]} \hat{M}, \\ \partial_{X_l} \partial_{X_k} M[X](V, W) &= \partial_{X_l} \partial_{X_k} \sqrt{\det G[x]}(V, W) \hat{M}, \\ \partial_{X_k} L[X](V) &= \frac{1}{d!} \left(\partial_{X_k} \sqrt{\det G[x]}(V) G[x]^{-1} \hat{\nabla} \hat{\Phi}_i \cdot \hat{\nabla} \hat{\Phi}_j \right. \\ &\quad \left. + \sqrt{\det G[x]} \partial_{X_k} (G[x]^{-1})(V) \hat{\nabla} \hat{\Phi}_i \cdot \hat{\nabla} \hat{\Phi}_j \right)_{i,j=0,\dots,d}, \\ \partial_{X_l} \partial_{X_k} L[X](V, W) &= \frac{1}{d!} \left(\partial_{X_l} \partial_{X_k} \sqrt{\det G[x]}(V, W) G[x]^{-1} \hat{\nabla} \hat{\Phi}_i \cdot \hat{\nabla} \hat{\Phi}_j \right. \\ &\quad \left. + \sqrt{\det G[x]} \partial_{X_l} \partial_{X_k} (G[x]^{-1})(V, W) \hat{\nabla} \hat{\Phi}_i \cdot \hat{\nabla} \hat{\Phi}_j \right)_{i,j=0,\dots,d}. \end{aligned}$$

C. Derivatives of the local anisotropic area functional

We restrict ourselves here to the evolution of polygonal curves under discrete Willmore flow and focus on the local area functional on a single line segment connecting points X_0 and X_1 in \mathbb{R}^2 . We have $A_\gamma[X] = \frac{1}{2} \sqrt{\det G[X]} \gamma(N)$, where $N = \frac{D^{90}(X_1 - X_0)}{|X_1 - X_0|}$ denotes the discrete normal and for $d = 1$ this time $G[X] = |X_1 - X_0|$. Due to the 1-homogeneity of γ we can rewrite A_γ and obtain $A_\gamma[X] = \frac{1}{2} \tilde{\gamma}(X_1 - X_0)$ with $\tilde{\gamma} = \gamma \circ D^{90}$. Hence, via straightforward differentiation we obtain

$$\begin{aligned} \partial_{X_i} A_\gamma(V) &= \tilde{\gamma},z(X_1 - X_0) \cdot V (\delta_{1i} - \delta_{0i}), \\ \partial_{X_j} \partial_{X_i} A_\gamma(V, W) &= \tilde{\gamma},zz(X_1 - X_0) V \cdot W (\delta_{1i} - \delta_{0i})(\delta_{1j} - \delta_{0j}), \\ \partial_{X_k} \partial_{X_j} \partial_{X_i} A_\gamma(V, W, Z) &= \tilde{\gamma},zzz(X_1 - X_0)(V, W, Z) (\delta_{1i} - \delta_{0i})(\delta_{1j} - \delta_{0j})(\delta_{1k} - \delta_{0k}). \end{aligned}$$

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