

# TEdit: A Distributed Tetrahedral Mesh Editor with Immediate Simulation Feedback

D. Ströter<sup>1</sup><sup>a</sup>, U. Krispel<sup>2,3</sup><sup>b</sup>, J. S. Mueller-Roemer<sup>1,4</sup><sup>c</sup> and D. W. Fellner<sup>1,3,4</sup><sup>d</sup>

<sup>1</sup>TU Darmstadt, Interactive Graphics Systems Group, Germany

<sup>2</sup>Fraunhofer Austria Research GmbH, Austria

<sup>3</sup>TU Graz, Institute of Computer Graphics and Knowledge Visualization, Austria

<sup>4</sup>Fraunhofer IGD, Darmstadt, Germany

**Keywords:** Computer Aided Design, Simulation Environments, Client Server Architectures, Massively Parallel and High-performance Simulations.

**Abstract:** The cycle of computer aided design and verification via physics simulation is often burdened by the use of separate tools for modeling and simulation, which requires conversion between formats, e.g. meshing for finite element simulation. This separation is often unavoidable because the tools contain specific domain knowledge which is mandatory for the task, for example a specific CAD modeling suite. We propose a distributed application that allows interactive modification of tetrahedral meshes, derived from existing CAD models. It provides immediate simulation feedback by offloading resource-intensive tasks onto multiple machines thereby enabling fast design cycles for individualized versions of mass-produced parts.

## 1 INTRODUCTION

Due to the persistent high cost, 3D printing is still not an option for mass production. However, it is increasingly used for individualized versions of mass-produced parts (D., 2018), albeit limited to purely cosmetic parts. To create custom versions of parts with a mechanical function, simulations of the modified part are required to ensure that it continues to fulfill its function. However, the usual iterative product development cycle of modifying a part in computer-aided design (CAD), remeshing it, and simulating it in a computer-aided engineering (CAE) tool is uneconomical in this context.

We present TEdit, a novel tetrahedral mesh editor with immediate simulation feedback, i.e. without tool switches or manual intervention and with minimal delay. By making use of the fact that high-quality tetrahedral meshes and corresponding simulation load cases already exist for mass-produced parts, we significantly shorten the product develop-

ment cycle for customized parts. By directly editing the tetrahedral mesh—not the CAD model—and using its triangular surface for printing, editing of the CAD model followed by full remeshing is avoided completely. GPU-accelerated simulation provides direct feedback (Sec. 2), while client hardware requirements are minimized using a multi-tier, distributed client-server architecture (Sec. 3). We developed a set of tetrahedral mesh editing operations that aim to preserve mesh quality, while maintaining the semantic relationship between boundary triangles that originally formed a CAD surface or form a new, contiguous surface after an edit to improve user interaction (Sec. 4).

## 2 RELATED WORK

Currently, there is little literature on tetrahedral mesh editing. Stoll et al. (Stoll et al., 2007) explore interactive shape editing of volumetric meshes using linear deformation with differential rotation updates. In order to enable intuitive interaction, they provide deformation-handles for users to grab. As our framework is designed for virtual prototyping, interaction

<sup>a</sup> <https://orcid.org/0000-0002-2672-7377>

<sup>b</sup> <https://orcid.org/0000-0001-8984-635X>

<sup>c</sup> <https://orcid.org/0000-0002-0712-0457>

<sup>d</sup> <https://orcid.org/0000-0001-7756-0901>

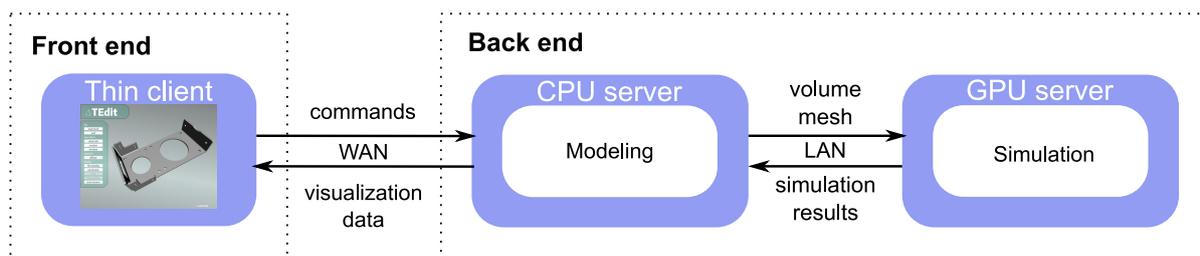


Figure 1: The system is composed of three main services, which may reside on different machines. This separates the interactive visualization front end from CPU-intensive geometry modification and GPU-intensive simulation tasks.

is a based on semantic faces to enable intuitively applying model modifications that go beyond deformations, such as hole closing. Mezger et al. (Mezger et al., 2009) propose to deform tetrahedral meshes using physically based simulation. Through the usage of a finite element method (FEM) model they avoid significant change in volume. In contrast, the goal of our work is a set of editing operations that enable adding or removing model parts, i.e. changing model topology. For engineering purposes, Serna et al. (Serna et al., 2010) propose an embodiment of the FEM mesh to allow manipulation of semantic features. Thus, engineers are able to perform extrusion, rounding or dragging operations on high-level semantic features. Our editing framework also relies on high-level semantic features to provide intuitive interaction, but directly imports explicit high-level faces from CAD models to provide intuitive user interaction. Xian et al. (Xian et al., 2011) present a mesh editing framework for finite element analysis (FEA) purposes. They decompose the mesh into local features representing the semantic meaning of parts, e.g. holes or protrusions. Editing operations such as deformations respect feature constraints and preserve element quality. Their editor does not support load distribution of compute intensive tasks due to execution on a single machine. In contrast, our tetrahedral mesh editor is distributed, enabling execution on the best-suited machines. A related geometry editing application is Inria’s Graphite (Inria, 2019). Like TEdit, Graphite enables users to fill holes and delete mesh facets in volumetric meshes. Its automatic hole detection can be controlled by a threshold of maximum boundary vertices. While Graphite focuses on 3D modeling and numerical optimization, TEdit is specifically designed to accelerate virtual prototyping, providing immediate (see Sec. 1) simulation feedback and interaction with semantic faces defined in CAD.

To achieve direct, low-latency simulation feedback, we use a fully GPU-accelerated FEA code based on the merged kernel modified preconditioned conjugate gradient (MPCG) solver by We-

ber et al. (Weber et al., 2013) and the fast tetrahedral system assembly method by Mueller-Roemer and Stork (Mueller-Roemer and Stork, 2018). As Mueller-Roemer and Stork’s method not only performs element stiffness matrix assembly on the GPU, but also determines the system matrix sparsity pattern efficiently in parallel, it is highly beneficial when not only tetrahedral mesh geometry, but also topology, is modified during editing. Weber et al.’s fast MPCG, a GPU-optimized version of Baraff and Witkin’s MPCG (Baraff and Witkin, 1998), minimizes kernel launch overheads and allows simulation of multiple sets of boundary conditions without having to assemble a new system matrix.

While we use a GPU-accelerated linear static solid mechanics simulation in our prototype, other accelerators, such as FPGAs, or different physical domains could be used with our approach, as long as the simulation code supports tetrahedral meshes.

### 3 ARCHITECTURE

The following points were considered in the design decisions for the architecture of the proposed system: The resource demand of the complete application is high, as mesh processing for larger meshes needs high single-core CPU performance and a large amount of RAM, the fast FEA requires a capable GPU, and the visualization part puts additional load on CPU and GPU performance as well. Thus, the approach is to create a distributed application instead of a monolithic one by grouping related components into services. These services communicate using a network protocol, which allows to run components on different machines and distribute the work load to computers with adequate hardware equipment. Thus, the requirements for the front end consist largely of what is needed for visualization and interaction. This approach also ensures a degree of encapsulation between existing components. In addition, simulation is overlapped with user interaction further reducing perceived latency. Communication takes place us-

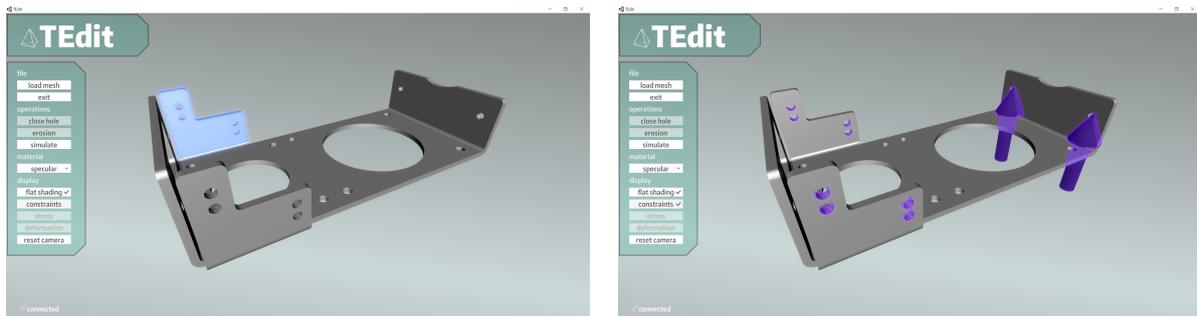


Figure 2: A user may quickly select relevant model parts, as a selection interaction automatically selects triangle groups, such as ones that originate from a single CAD surface (*left*). Furthermore, simulation load cases are visualized by highlighting surfaces, such as constrained surfaces, or surfaces with applied forces (*right*).

ing WebSockets, in order to facilitate easy integration into various front end implementations such as web browsers, to facilitate the use and dissemination of CAD visualizations (Krispel et al., 2018). An overview of services and communication is shown in Fig. 1.

### 3.1 Workflow and Communication

The front end service presents the model to the user in an interactive manner. The user may select parts of the model and perform an editing operation. The modification command and its parameters are sent to the modeling back end where the topological modifications are performed; results are sent back to the front end. At the same time, the updated mesh is sent to the simulation service and simulation of the previously selected load case is started. After simulation, the selected field is sent back to the front end.

Although simulation has to be performed on the tetrahedral representation, the outer surface triangles of the tetrahedral mesh are sufficient for visualization. Thus, the main data for communication from the front end’s point of view consists of modeling commands with model part selections upstream, and surface and simulation data downstream. On the back end side, the modeling service sends tetrahedral meshes to the simulation service, and receives simulation results, such as scalar fields on the mesh. To minimize (de)serialization and bandwidth overhead, we use an efficient binary protocol based on Protocol Buffers (Google, 2020).

One challenge with a distributed modeling system is the synchronization of model state between the services. In our implementation, the front end service communicates only with the modeling service on the back end side, the modeling service communicates with the simulation service using the tetrahedral mesh representation (see Fig. 1). Operations and visualization updates are carried out asynchronously,

to keep the user interface responsive during modeling and simulation. A user may issue one command before a response is received, while still being able to navigate and inspect the model.

### 3.2 Front End

Game engines have gained in popularity for development of 3D interfaces in many areas outside of games, as they provide solid frameworks for rapid development of interactive 3D applications. We chose the Unity platform (Unity, 2020) for implementing our front end service. The viewer consists of an interactive 3D rendering and a navigation interface in which the user inspects and modifies the model, or inspects simulation load cases and simulation results (see Figure 2). The system maintains an association of triangle to groups, such as those originating from a single CAD face or editing operation, facilitating selection of such semantic groups for fast interaction with the model.

When sending a command message, the front end service puts itself into a waiting mode; command buttons are disabled until a reply is received, but the model can still be rotated or moved.

### 3.3 Modeling and Simulation Services

To enable optimal use of hardware for tetrahedral mesh editing, which typically requires a large amount of RAM and high single-core performance, and simulation, which requires an NVIDIA GPU in our case (Sec. 2), but is not limited by single core performance, the back end is further split into a modeling service and a simulation service. This results in a distributed, multi-tier client-server architecture, as the modeling service acts as a server for the front end, while acting as a client for the simulation service. The client therefore only communicates with the modeling service directly (Fig. 1).

While the front end only requires the boundary mesh, as well as simulation results (see Figs. 3 and 4 in the following section), for selection and visualization, both modeling and simulation operate on tetrahedral meshes. Therefore, the front end can be remote and connected via a high-latency, low-bandwidth connection (latency-free interaction remains possible due to asynchronous operation), but both back end services should run in the same data center for low-latency, high-bandwidth communication, as full volumetric meshes are exchanged.

## 4 GEOMETRY EDITING

To avoid forcing the user to interact with individual boundary triangles, TEdit uses CAD surface IDs to associate every boundary triangle with its originating CAD surface. This information is provided directly by hierarchical meshers such as Gmsh (Geuzaine and Remacle, 2009). Surface IDs are preserved throughout the editing operations described in the following. Additionally, a mapping telling the client which surfaces were added, removed, or merged is generated and used to update both constraint visualizations as well as boundary conditions for the simulation tool.

### 4.1 Volumetric Hole Filling

We present an algorithm for filling holes in the model, for example to remove unneeded drill holes or holes that were included for weight saving, but turned out to introduce large stresses. An example is shown in Fig. 3. Users may select a set of surfaces representing the shell of a drill hole. On the back end side, such a shell is associated with a non-manifold triangular surface mesh that is part of the tetrahedral mesh. We present an algorithm to fill selected holes in the tetrahedral mesh's surface by performing the following four steps:

1. Detect boundary loops in the surface mesh of the selected triangles
2. Two-dimensional constrained meshing for each boundary loop
3. Three-dimensional constrained meshing using the resulting 2-manifold surface
4. Merge the resulting volume mesh with the mesh representing the model

Specifically, the service identifies selection boundary loops by finding edges which are topologically connected to just one triangle and sorting these. A simple sorting procedure for boundary loops is to

pick an arbitrary initial boundary edge and search for the next adjoining edge until the initial edge recurs. We accelerate boundary loop identification by sorting edges by indices and successively marking edges belonging to a loop. Whenever this sorting procedure finds a boundary loop, it searches for an unmarked edge indicating that there is an unidentified boundary loop. If such an edge exists, it is the new initial boundary edge for another boundary loop identification pass. Otherwise the procedure terminates and returns the obtained boundary loop edges with array offset positions. For each boundary loop, we project the boundary vertices onto the plane including the co-planar boundary edges, in order to apply a two dimensional constrained Delaunay triangulator for hole filling. In TEdit, we use Shewchuck's Triangle library (Shewchuk, 1996), but our concept generalizes to arbitrary constrained Delaunay triangulation schemes. After meshing terminates, the resulting triangulation is transformed to 3D and merged with the triangular surface shell of the drill hole. The resulting triangular surface mesh is 2-manifold. Hence, a three-dimensional constrained Delaunay triangulator can be used to generate a tetrahedral mesh of the hole. We use the TetGen library (Si, 2015) in this project. Finally, we merge the newly generated tetrahedra and vertices with the original tetrahedral mesh. For this purpose, it suffices to reassign original vertex indices to shared vertices and assign consecutive indices to newly generated vertices.

### 4.2 Erosion

Our erosion algorithm enables users to remove plate-like parts of the model or reduce thickness, while preserving mesh quality. Figure 4 shows an example. On the front end side, users may select surfaces—triangle groups—for erosion. The modeling service receives a set of surface triangles from which erosion is supposed to start. In order to preserve adjacent semantic surfaces, we identify the boundary vertices of the triangle set and omit them beforehand. Our erosion scheme marks tetrahedra including any input vertex as to be deleted. In order to prevent erosion from retaining groups of tetrahedra not connected to the initial part, we propagate a flood fill from tetrahedra which are definitely not removed from the initial part, i.e. tetrahedra belonging only to unselected semantic faces. We mark tetrahedra not reached by flood fill for deletion. The triangles of the new surface can be found by checking if triangles are connected to a marked and an unmarked tetrahedron. We identify vertices to be deleted by marking vertices not belonging to a marked tetrahedron. An exclusive prefix sum

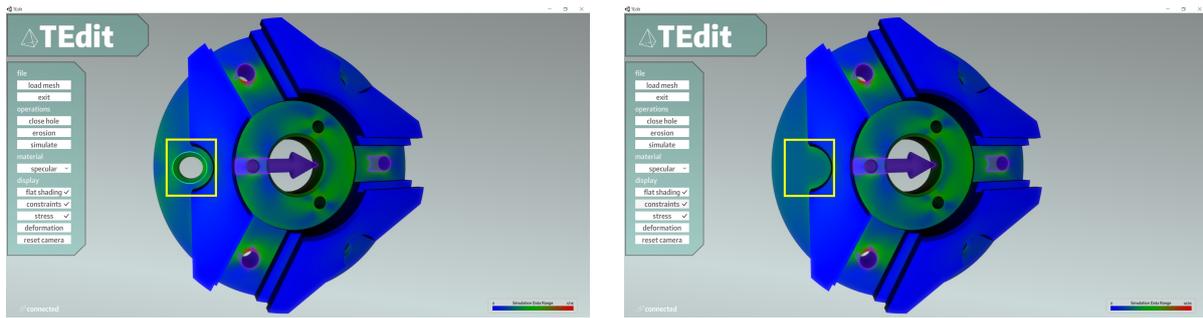


Figure 3: Von Mises stress before (*left*) and after (*right*) filling the selected hole (highlighted in yellow). The model was provided by N. M. Patel via GrabCAD (Patel, 2020).

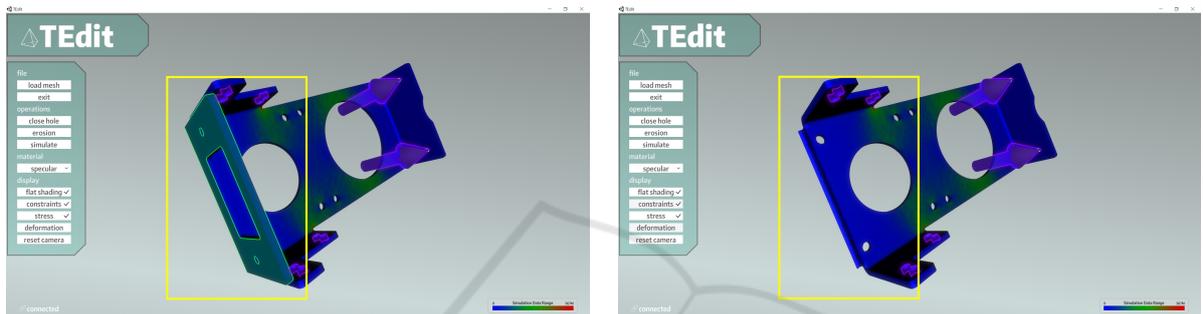


Figure 4: Von Mises stress before (*left*) and after (*right*) eroding the selected part of the model (highlighted in yellow). The model is part of the ABC dataset (Koch et al., 2019).

on marked vertices yields their array index positions. This is used to update the indices of the remaining tetrahedra.

When erosion terminates, a coarse surface with tetrahedra protruding from the surface remains. However, we aim to create a smooth surface. At the same time, the resulting tetrahedral mesh must be free of ill-formed and degenerate tetrahedra for simulation. Consequently, we perform a quality-optimization-based surface smoothing method after element erosion. This method performs a combination of topological transformations and optimization-based vertex smoothing due to the substantial advantage over using just a single optimization operation (Klingner and Shewchuk, 2008). We build upon harmonic triangulation by Alexa (Alexa, 2019) for mesh optimization, as it is effective in removing slivers and improving dihedral angles with a small set of optimization operations, i.e. bistellar flips and vertex position relocation. As many tetrahedra have four boundary vertices, our optimization method initially checks, if performing a bistellar 2 to 3 flip at an interior face improves quality. If it does, we perform the flip. After flipping, we improve mesh quality by performing line search for each single interior vertex in a Gauss-Seidel iterations manner. The next step is to smooth the surface by computing the cotangent Laplacian (Nealen et al.,

2006) gradient. In forward-backward Gauss-Seidel iterations, we use bracketing to find an inversion-free position for the boundary vertex. If no such position can be found, the vertex remains at its position and may be updated by following iterations. In addition to preventing inversions, it can also be ensured that the resulting tetrahedra shall not exceed a predetermined quality threshold. We alternate flipping, interior vertex optimization, and surface smoothing for one or more iterations.

### 4.3 Element Quality

A single ill-shaped element can cause a simulation to fail (Shewchuk, 2002). In addition, the FEM does not work, if the tetrahedral mesh includes inverted elements or elements of infinitesimally small volume. Consequently, we evaluate the element quality of the meshes modified using our geometry editing algorithms. Table 1 presents volumes and aspect ratios—calculated as inradius over circumradius, resulting in a range of  $[0, \frac{1}{3}]$  (Cheng et al., 2012)—of the resulting meshes for both editing operations. Hole filling produces a mesh with high quality aspect ratios. No infinitesimally small volume tetrahedra occur in the resulting mesh. Moreover, the resulting elements exhibit non negative volumes. The erosion opera-

Table 1: Maximum, minimum, and median volumes and aspect ratios (higher is better) of the meshes shown on the left hand sides (before) and right hand sides (after) of Fig. 3 (hole fill) and Fig. 4 (erosion).

Edit Op.	Volume			Aspect Ratio		
	Max.	Min.	Med.	Max.	Min.	Med.
Before Hole Fill	3.3e-10	1.4e-11	1.1e-10	.3333	.0803	.2737
After Hole Fill	2.4e-9	1.4e-11	1.1e-10	.3333	.0456	.2736
Before Erosion	1.6e-10	5.4e-12	4.9e-11	.3333	.0872	.2688
After Erosion	1.6e-10	1.0e-12	4.9e-11	.3333	.0004	.2689

tion with six iterations of subsequent quality preserving surface smoothing did not introduce inverted elements or infinitesimally small volume tetrahedra. The resulting tetrahedra exhibit sufficient aspect ratios. As a result, both mesh editing operations succeed at producing meshes suitable for the FEM, as we have also validated in our experiments.

## 5 CONCLUSIONS

In summary, we have introduced a novel tetrahedral mesh editor with immediate simulation feedback. By directly operating on CAE meshes, modifications can be performed and simulated, while avoiding switching to a CAD tool and remeshing the entire domain. As 3D printing can support and often only supports discrete triangular surfaces, this approach avoids having to feed back the results into a CAD tool completely. While the current set of editing operations is somewhat limited, our prototype demonstrates how the iterative product design loop can be shortened for individualized versions of mass-produced parts.

The use of a GPU-accelerated FEA solver ensures short iteration times, while the distributed architecture minimizes user hardware requirements. Due to the use of Unity (Unity, 2020) and WebSockets, the front end can be deployed directly as a web application. Bandwidth requirements are low due to the use of surface meshes only between the front end and the modeling service (the modeling and simulation service should reside in the same data center, as they exchange volumetric meshes).

As the implemented editing operations preserve the correspondence between individual boundary triangles and their originating CAD surface IDs (or a newly created contiguous surface ID), the user can interact at a significantly higher level of abstraction than individual surface triangles. Furthermore, this allows automatic remapping of surface-based boundary conditions for simulation. Additionally, mesh optimization ensures mesh quality is preserved.

## 5.1 Future Work

Besides the extension to further editing operations, iteration times could be further reduced in the future by performing geometry processing on the GPU, as done by Mueller-Roemer et al. (Mueller-Roemer et al., 2017). While our local, topological erosion works well for the removal of fin- or plate-like structures, the addition of geometric morphological operations, such as the opening and closing operations on triangle meshes recently shown by Sellán et al. (Sellán et al., 2020), could greatly improve the flexibility of the editor. Furthermore, hole filling could be extended to non-planar holes by reparametrization of the loop into 2D space and subsequent determination of interior point positions in 3D by solving a Laplacian.

## REFERENCES

- Alexa, M. (2019). Harmonic triangulations. *ACM Transactions on Graphics*, 38(4):1–14.
- Baraff, D. and Witkin, A. (1998). Large steps in cloth simulation. In *Proceedings of the 25th annual conference on Computer graphics and interactive techniques*, SIGGRAPH '98, pages 43–54.
- Cheng, S.-W., Dey, T. K., and Shewchuk, J. (2012). *Delauy mesh generation*. CRC Press.
- D., J. (2018). Mini offers 3D printing personalization services for its cars. [Online; accessed Dec-2020]. <https://www.3dnatives.com/en/3d-printing-mini-100120184/>.
- Geuzaine, C. and Remacle, J.-F. (2009). Gmsh: A 3-d finite element mesh generator with built-in pre- and post-processing facilities. *International Journal for Numerical Methods in Engineering*, 79(11):1309–1331.
- Google (2020). Protocol buffers. [Online; accessed Dec-2020]. <https://developers.google.com/protocol-buffers/>.
- Inria (2019). Graphite. [Online; accessed Dec-2020]. <http://alice.loria.fr/index.php?option=com-content&view=article&id=22>.
- Klingner, B. M. and Shewchuk, J. R. (2008). Aggressive tetrahedral mesh improvement. In *Proceedings of the 16th International Meshing Roundtable*, pages 3–23.
- Koch, S., Matveev, A., Jiang, Z., Williams, F., Artemov, A., Burnaev, E., Alexa, M., Zorin, D., and Panozzo, D. (2019). ABC: A big CAD model dataset for geometric deep learning. In *2019 IEEE/CVF Conference on Computer Vision and Pattern Recognition*.
- Krispel, U., Settgast, V., and Fellner, D. W. (2018). Dynamo - dynamic 3d models for the web: A declarative approach to dynamic and interactive 3d models on the web using x3dom. In *Proceedings of the 23rd International ACM Conference on 3D Web Technology*, Web3D '18, New York, NY, USA. Association for Computing Machinery.

- Mezger, J., Thomaszewski, B., Pabst, S., and Straßer, W. (2009). Interactive physically-based shape editing. *Computer Aided Geometric Design*, 26(6):680–694.
- Mueller-Roemer, J. S., Altenhofen, C., and Stork, A. (2017). Ternary sparse matrix representation for volumetric mesh subdivision and processing on GPUs. *Computer Graphics Forum*, 36(5):59–69.
- Mueller-Roemer, J. S. and Stork, A. (2018). GPU-based polynomial finite element matrix assembly for simplex meshes. *Computer Graphics Forum*, 37(7):443–454.
- Nealen, A., Igarashi, T., Sorkine, O., and Alexa, M. (2006). Laplacian mesh optimization. In *Proceedings of the 4th international conference on Computer graphics and interactive techniques in Australasia and South-east Asia*, pages 381–389.
- Patel, N. M. (2020). Simple mechanical part 7. [Online; accessed Dec-2020]. GrabCAD Community, <https://grabcad.com/library/simple-mechanical-part-7-1>.
- Sellán, S., Kesten, J., Sheng, A. Y., and Jacobson, A. (2020). Opening and closing surfaces. *ACM Transactions on Graphics*, 39(6):1–13.
- Serna, S. P., Stork, A., and Fellner, D. W. (2010). Tetrahedral mesh-based embodiment design. In *International Design Engineering Technical Conferences and Computers and Information in Engineering Conference*.
- Shewchuk, J. (2002). What is a good linear finite element? interpolation, conditioning, anisotropy, and quality measures (preprint). *University of California at Berkeley*, 73:137.
- Shewchuk, J. R. (1996). Triangle: Engineering a 2d quality mesh generator and Delaunay triangulator. In *Applied Computational Geometry Towards Geometric Engineering*, pages 203–222.
- Si, H. (2015). TetGen, a Delaunay-based quality tetrahedral mesh generator. *ACM Transactions on Mathematical Software*, 41(2):1–36.
- Stoll, C., de Aguiar, E., Theobalt, C., and Seidel, H.-P. (2007). A volumetric approach to interactive shape editing. Technical Report MPI-I-2007-4-004, Max-Planck-Institut für Informatik.
- Unity (2020). Unity real-time development platform. [Online; accessed Dec-2020]. <https://unity.com/>.
- Weber, D., Bender, J., Schnoes, M., Stork, A., and Fellner, D. W. (2013). Efficient GPU data structures and methods to solve sparse linear systems in dynamics applications. *Computer Graphics Forum*, 32(1):16–26.
- Xian, C., Gao, S., and Zhang, T. (2011). Tetrahedral mesh editing with local feature manipulations. In *2011 12th International Conference on Computer-Aided Design and Computer Graphics*, pages 130–137.