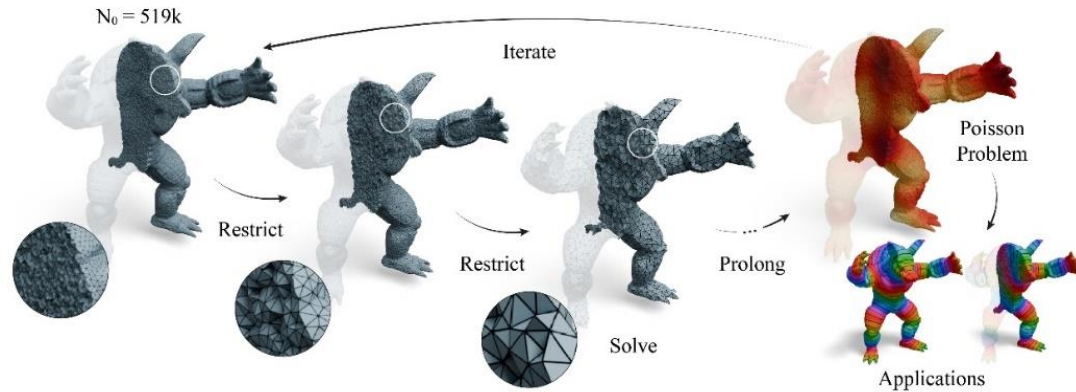


GravoTet

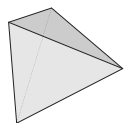
A Fast Multigrid Hierarchy Construction
for Tetrahedral Meshes



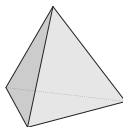
Marcel Padilla¹, Ruben Wiersma¹, Tim Huisman², Jackson Campolattaro²,
Olga Sorkinge-Hornung¹, Klaus Hildebrandt²

Motivation

Input:



Tetrahedral Mesh
Volume



$$\Delta u = 0$$

Heat equation

- Solving PDEs with Laplacians
 - Direct solving scales poorly
 - SOTA: CHOLMOD

Is there a faster way?



<https://github.com/alecjacobson/sparse-solver-benchmark>

Multigrid methods

$$Ax = b$$

Sparse symmetric matrix system

- Focus computation
- Hi-res = details
 - Use fast local methods
- Lo-res = global structure
 - Use global methods efficiently
- Communicate between levels
 - Residuals + smoothing

V-Cycle algorithm

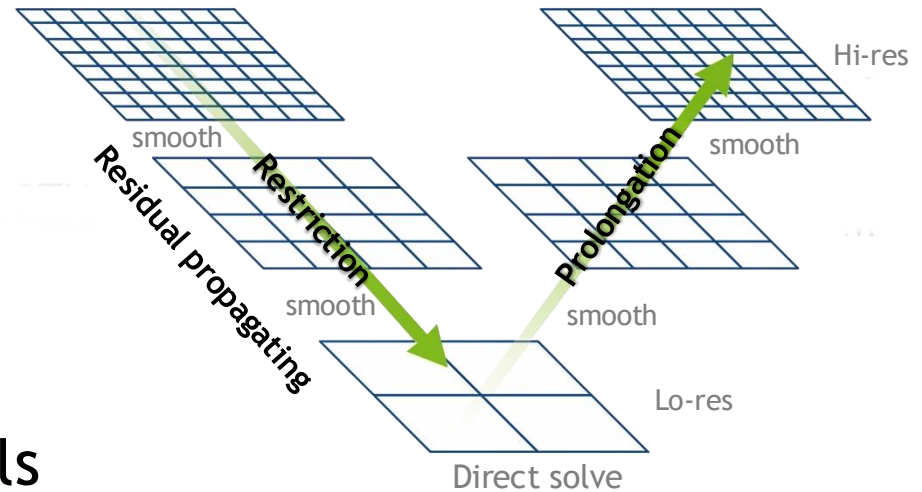


Image: Numerical Geodynamic Modelling - Taras Gerya

Multigrid methods

Matrix operations:

$$P_l \in \mathbb{R}^{N_{l-1} \times N_l}$$

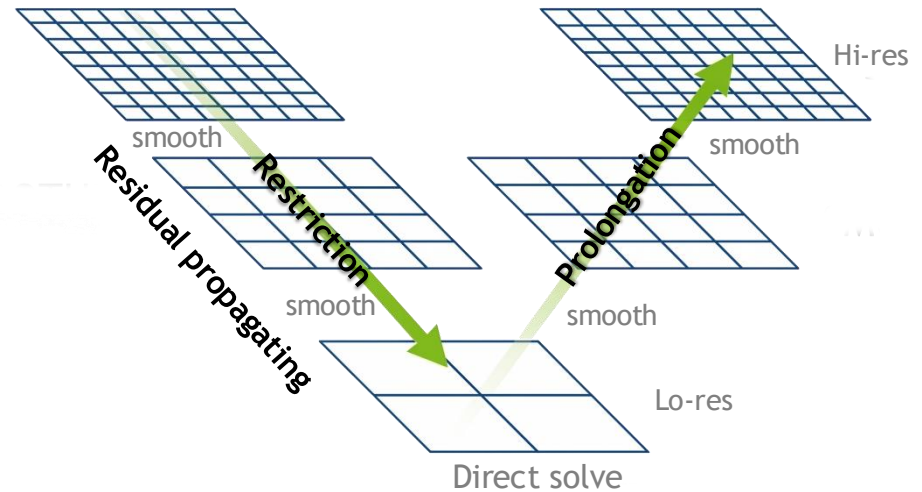
Prolongation matrix. Maps lo-res to hi-res

$$A^{l+1} = P_l^T A^l P_l$$

Matrix Restriction

★ Key ingredient: $P_1, P_2, \dots$

V-Cycle algorithm



Multigrid methods

3D Volume Geometric Multigrid Methods

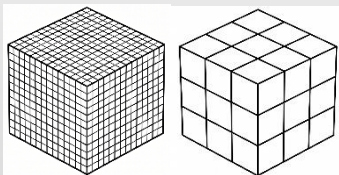
Input:



Tetrahedral Mesh

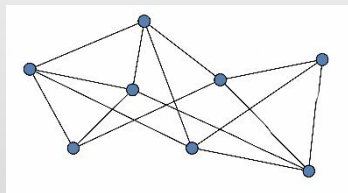
Boundary is a surface

Grid methods



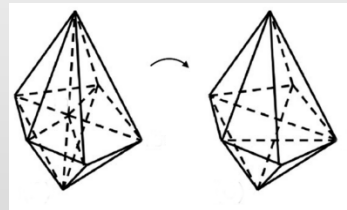
Poor boundary realization

Graph based methods



Slow convergence

Tet methods:
edge collapse



Very slow construction

Can we get fast construction of P_l with good convergence? 🧠

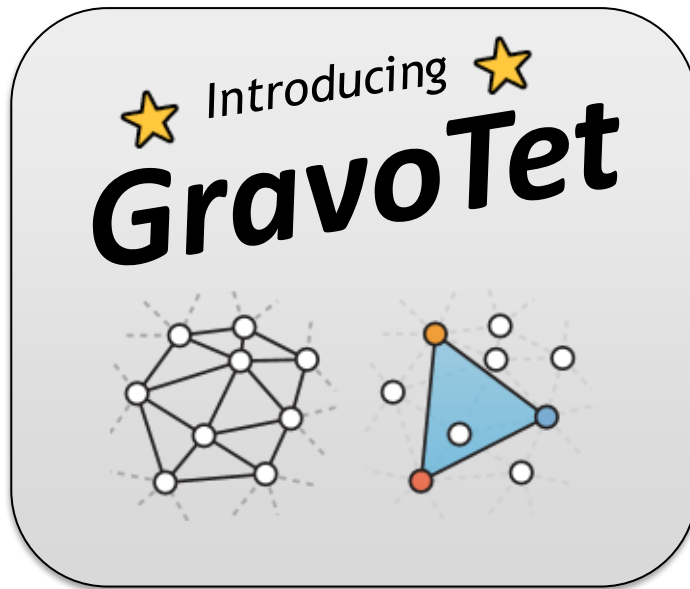
Multigrid methods

Input:



Tetrahedral Mesh

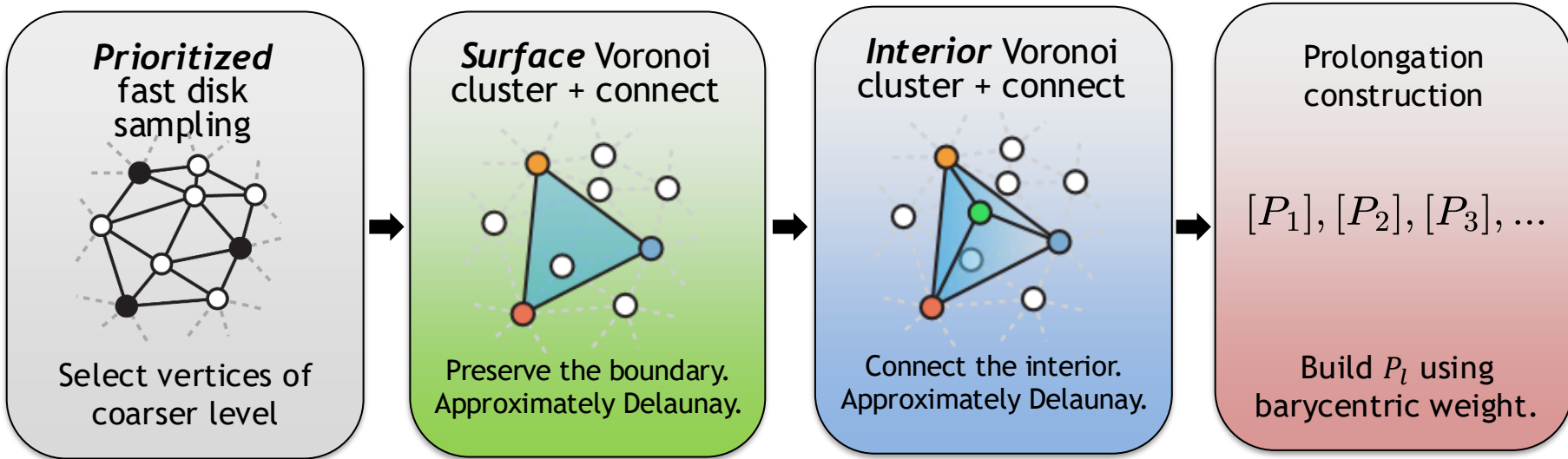
Boundary is a surface



GravoTet

Introducing  **GravoTet** 

Graph Voronoi Tetrahedral Multigrid Method
fast & effective coarsening strategy



GravoTet



Compute and sort vertices by features

Boundary features to preserve!

Prioritized
fast disk
sampling



Select vertices of
coarser level



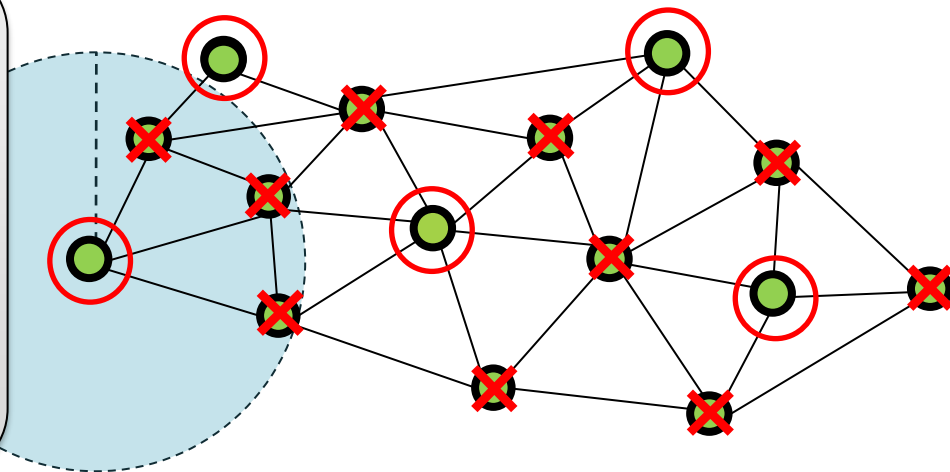
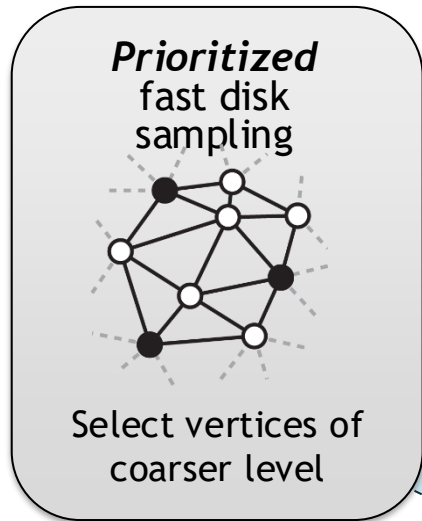
- Face-star normal variation
- Low in flat areas.

GravoTet



Compute and sort vertices by features

Boundary features to preserve!



- Exclude points that are too close
- Exclusion check 2-ring neighbours.
 - Linear time



The resulting vertex list sorted by parent feature!
(no resorting needed)

GravoTet



Core idea

Surface Voronoi
cluster + connect



Preserve the boundary.
Approximately Delaunay.

Voronoi diagram

dual



Delaunay

Graph
Voronoi diagram

$\approx$ dual



Faster

Approximately
Delaunay

GravoTet



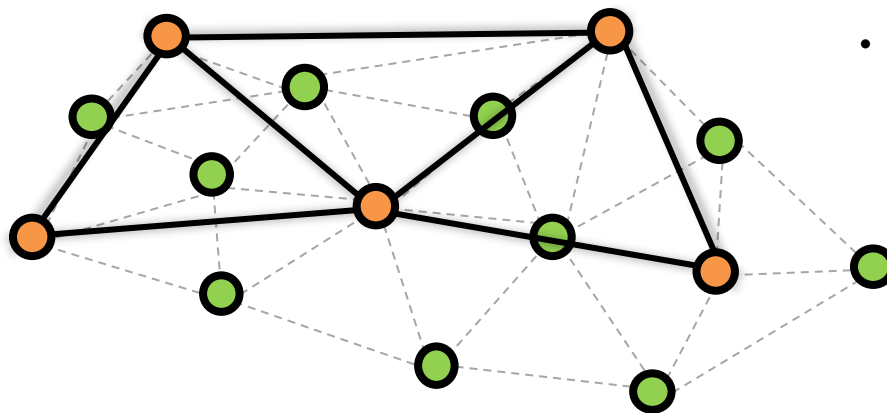
Cluster by Voronoi connectivity

Assign fine vertices to the graph-nearest coarse vertex representative

Surface Voronoi
cluster + connect



Preserve the boundary.
Approximately Delaunay.

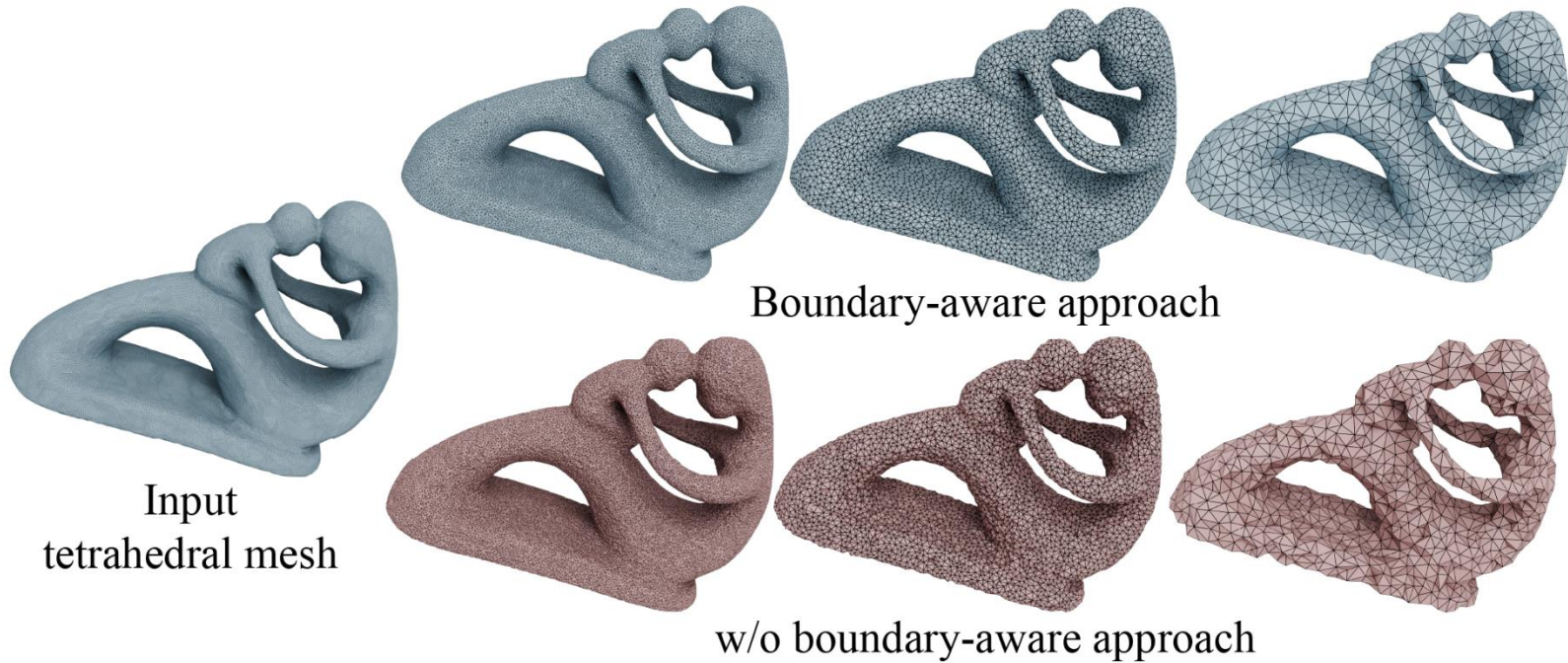


- If two fine vertices with different coarse representative vertices are connected:
 - Connect the coarse vertices
 - Fast 🐾
 - *Not Delaunay*



Used ONLY the surface vertices! To preserve boundary

Surface first!



GravoTet



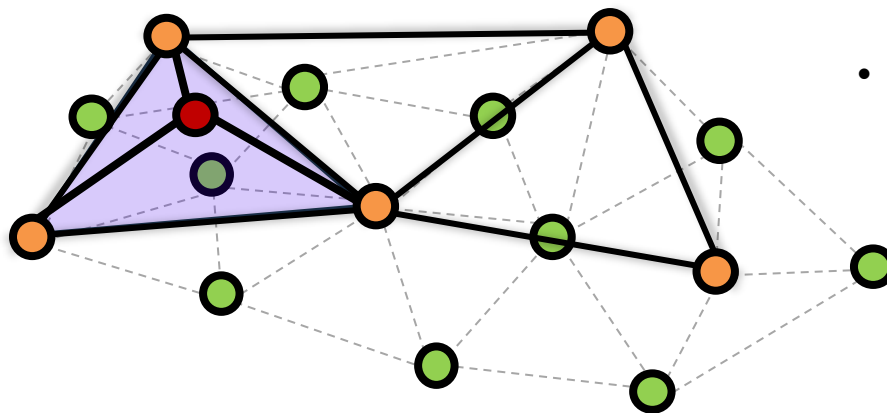
Repeat the same step to the interior!

The surface connectivity remains intact.

Interior Voronoi
cluster + connect



Connect the interior.
Approximately Delaunay.



- If two fine vertices with different coarse representative vertices are connected:
 - Connect the coarse vertices
 - *Not Delaunay*



Now **ALL** the coarse vertices are connected

GravoTet



Compute tet weights

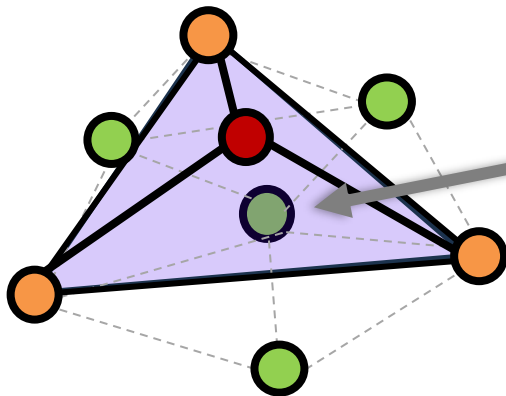


Or project to triangles, lines, points. The surface connectivity remains intact.

Prolongation
construction

$[P_1], [P_2], [P_3], \dots$

Build P_l using
barycentric weight.



For the fine points:

- Identify containing tet
- Compute barycenter weights for P_l



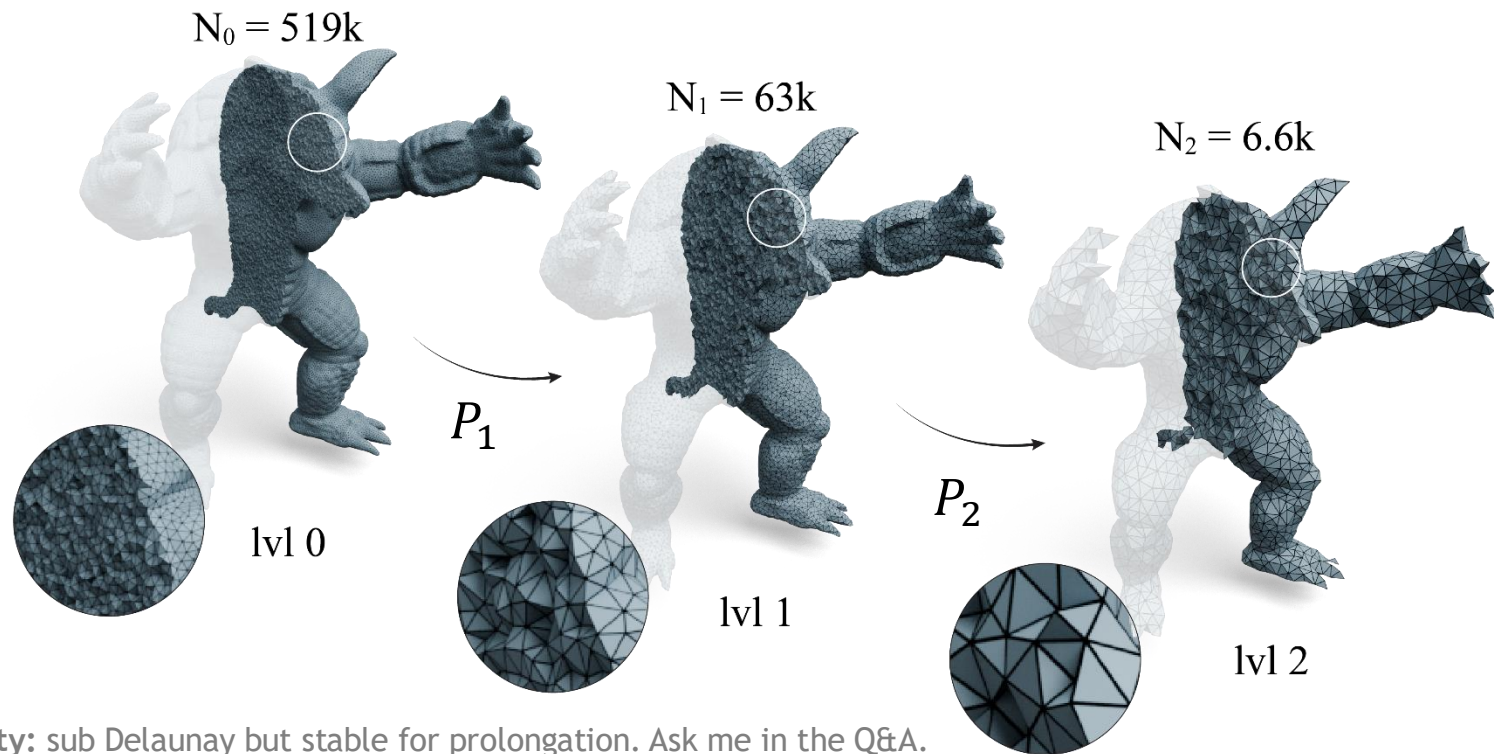
P_l has at most 4 non-zero entries per row.



Tetrahedra may overlap. And that is ok!



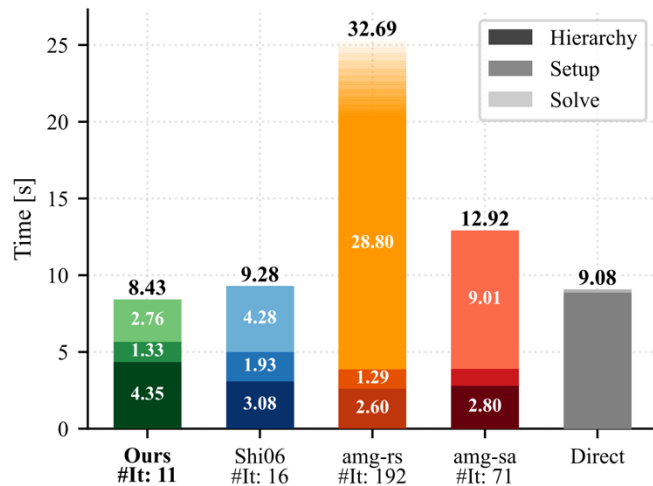
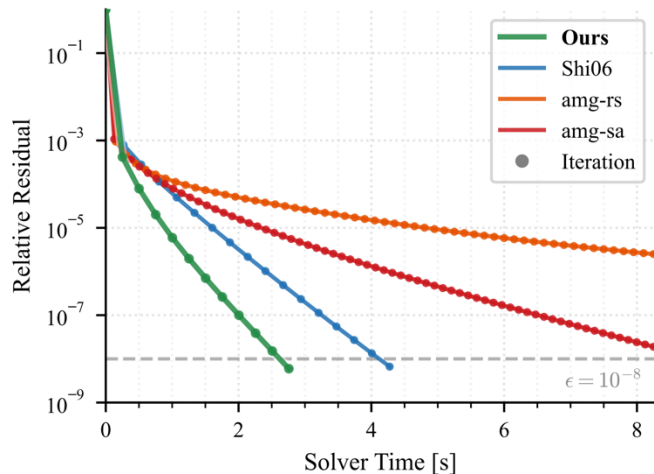
Resulting Mesh Hierarchy



Mesh quality: sub Delaunay but stable for prolongation. Ask me in the Q&A.

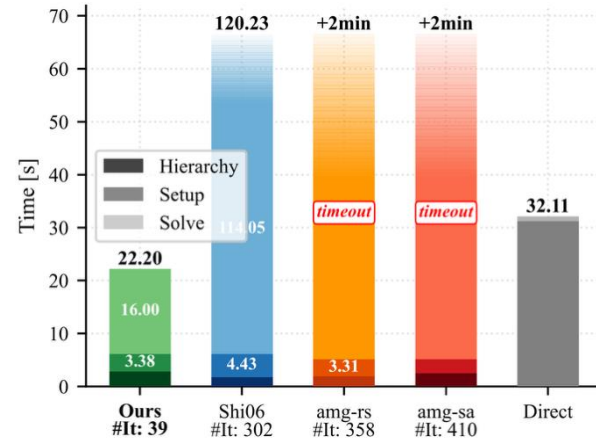
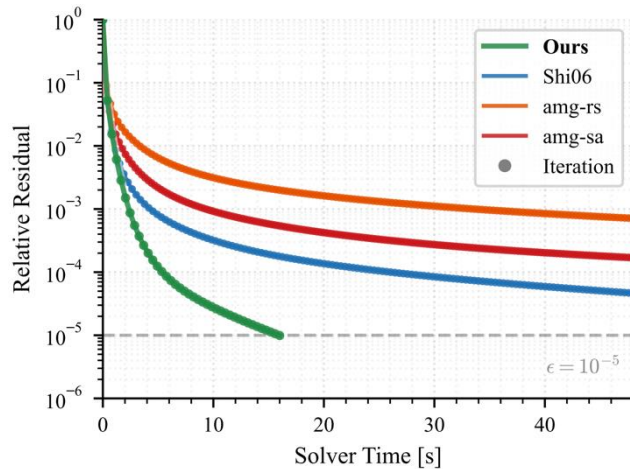
Armadillo *Poisson* Problem

Input: 519k vertices



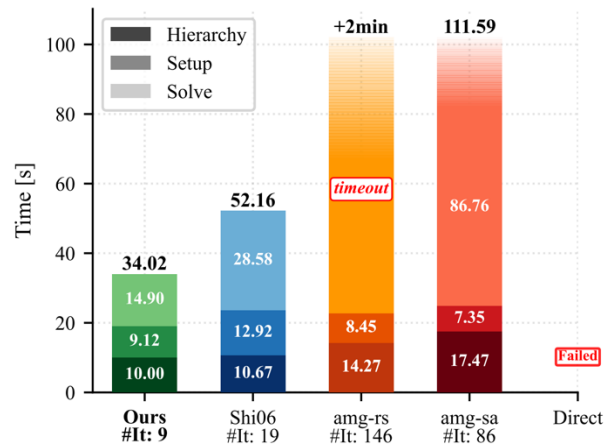
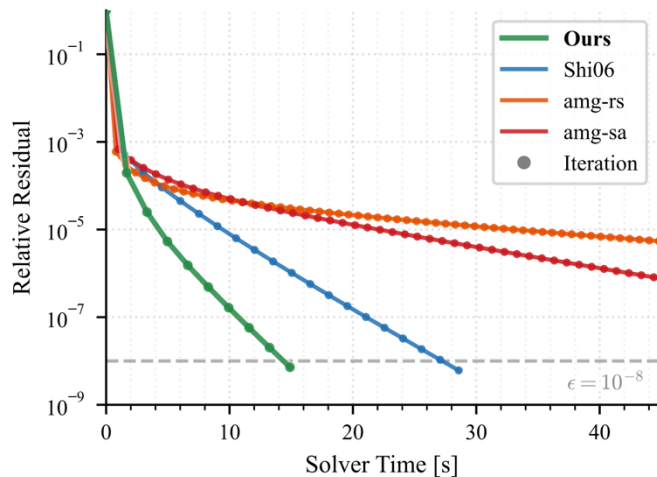
Armadillo *Biharmonic* Problem

Input: 519k vertices



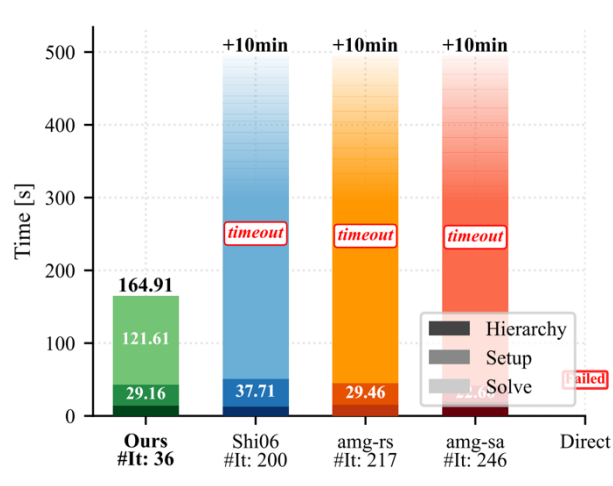
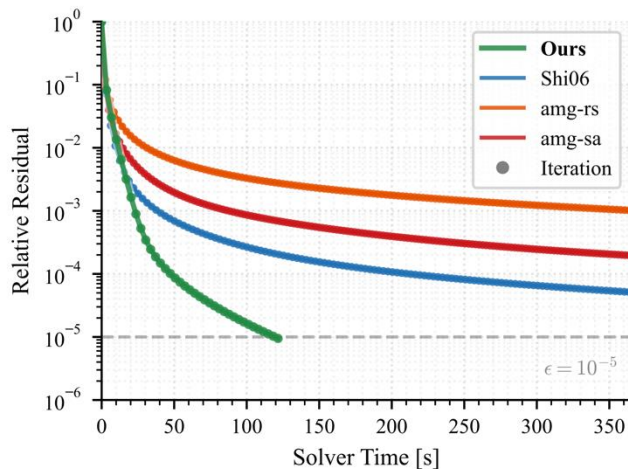
Fertility *Poisson* Problem

2.8M vertices



Fertility *Biharmonic* Problem

2.8M vertices



- Best total time 🏃 (if not tiny meshes)
- Lowest number of iterations needed 🏆

A collection of 20 diverse 3D models, including a teardrop, a cow, a rabbit, a dragon, a teapot, a bust, and various abstract shapes, all rendered in a uniform blue-grey color. The models are arranged in a grid-like fashion on a white background, showcasing a wide variety of forms and styles.



Performance - Biharmonic

- Best total time 🏃 (if not tiny meshes)
- Lowest number of iterations needed 🏆

From 22k to 2.8M vertices

Model	#Vert N_I	Ours				Shi06				AMG-RS				AMG-SA				Direct (CHOLMOD)		
		Build	Solve	Total	#It	Build	Solve	Total	#It	Build	Solve	Total	#It	Build	Solve	Total	#It	Fact.	Subst.	Total
BIHARMONIC PROBLEMS																				
Fandisk	22k	0.12	0.32	0.44	24	0.08	0.67	0.76	52	0.06	2.43	2.48	290	0.06	1.18	1.24	156	0.52	0.01	0.53
Homer	33k	0.23	0.63	0.87	20	0.14	1.91	2.05	94	0.08	19.27	19.35	911	0.09	6.48	6.57	369	1.39	0.03	1.42
Teapot	52k	0.33	1.30	1.63	39	0.16	3.30	3.46	99	0.13	14.99	15.13	613	0.13	6.33	6.46	312	1.63	0.05	1.68
Horse	74k	0.45	1.49	1.94	26	0.25	5.70	5.93	133	0.20	58.91	59.11	1803	0.19	13.99	14.18	518	2.05	0.05	2.11
Spike	102k	0.66	3.34	4.00	47	0.31	15.36	15.67	236	0.29	<i>time out</i>	<i>> 1min</i>	1185	0.27	33.29	33.56	778	4.29	0.11	4.40
Max Planck	157k	1.00	4.91	5.91	44	0.51	26.74	27.25	264	0.47	<i>time out</i>	<i>> 1min</i>	721	0.61	<i>time out</i>	<i>> 1min</i>	900	7.24	0.17	7.42
Ring	208k	1.17	4.68	5.85	26	0.60	15.01	15.61	101	0.63	<i>time out</i>	<i>> 1min</i>	568	0.84	34.22	35.05	386	6.53	0.15	6.68
Rocker Arm	262k	1.47	5.76	7.23	24	1.64	27.48	29.12	153	0.83	<i>time out</i>	<i>> 1min</i>	442	1.13	<i>time out</i>	<i>> 1min</i>	539	9.41	0.22	9.63
Bob	309k	2.51	10.30	12.81	42	1.01	51.16	52.17	241	1.03	<i>time out</i>	<i>> 1min</i>	344	1.42	<i>time out</i>	<i>> 1min</i>	415	14.37	0.33	14.69
Cylinder	310k	1.96	9.81	11.77	38	1.08	41.47	42.56	193	1.07	<i>time out</i>	<i>> 1min</i>	346	1.38	<i>time out</i>	<i>> 1min</i>	422	12.81	0.30	13.11
Bunny	411k	2.22	18.85	21.07	56	1.28	99.69	100.97	329	1.47	<i>time out</i>	<i>> 2min</i>	472	1.94	<i>time out</i>	<i>> 2min</i>	553	30.82	1.39	32.21
Cube 80 ³	512k	2.64	26.63	29.57	80	1.65	78.27	79.92	327	4.63	35.38	40.01	51	2.25	<i>time out</i>	<i>> 2min</i>	507	40.13	0.97	41.10
Armadillo	519k	2.81	19.38	22.20	39	1.75	118.48	120.23	302	1.88	<i>time out</i>	<i>> 2min</i>	358	2.53	<i>time out</i>	<i>> 2min</i>	410	31.23	0.88	32.11
Nefertiti	617k	2.81	25.82	28.62	43	2.22	<i>time out</i>	<i>> 2min</i>	266	2.39	<i>time out</i>	<i>> 2min</i>	290	3.12	<i>time out</i>	<i>> 2min</i>	326	56.01	7.24	63.25
Spot	709k	3.14	32.48	35.61	48	2.61	<i>time out</i>	<i>> 2min</i>	230	2.87	<i>time out</i>	<i>> 2min</i>	250	3.67	<i>time out</i>	<i>> 2min</i>	283	<i>failed</i>	<i>failed</i>	<i>failed</i>
Spike Ball	829k	3.93	60.10	69.03	61	4.45	<i>time out</i>	<i>> 4min</i>	353	4.93	<i>time out</i>	<i>> 4min</i>	456	6.80	<i>time out</i>	<i>> 4min</i>	303	<i>failed</i>	<i>failed</i>	<i>failed</i>
Beast	881k	6.30	42.16	48.46	51	4.94	<i>time out</i>	<i>> 4min</i>	216	3.50	<i>time out</i>	<i>> 4min</i>	236	3.23	<i>time out</i>	<i>> 4min</i>	267	<i>failed</i>	<i>failed</i>	<i>failed</i>
Cube 100 ³	1.0M	6.07	63.66	69.72	90	3.42	242.62	246.03	335	10.75	96.51	107.26	69	4.86	<i>time out</i>	<i>> 4min</i>	484	<i>failed</i>	<i>failed</i>	<i>failed</i>
Dragon	1.0M	0.06	45.13	55.19	31	5.93	<i>time out</i>	<i>> 4min</i>	193	6.60	<i>time out</i>	<i>> 4min</i>	239	8.84	<i>time out</i>	<i>> 4min</i>	313	<i>failed</i>	<i>failed</i>	<i>failed</i>
Happy Buddha	1.2M	1.39	72.70	84.09	44	8.09	<i>time out</i>	<i>> 6min</i>	239	8.56	<i>time out</i>	<i>> 6min</i>	264	11.52	<i>time out</i>	<i>> 6min</i>	298	<i>failed</i>	<i>failed</i>	<i>failed</i>
Ocotac	1.5M	1.78	53.31	61.29	27	5.97	<i>time out</i>	<i>> 4min</i>	207	7.05	<i>time out</i>	<i>> 4min</i>	224	8.74	<i>time out</i>	<i>> 4min</i>	257	<i>failed</i>	<i>failed</i>	<i>failed</i>
Kitten	1.5M	8.47	75.77	84.23	46	6.18	<i>time out</i>	<i>> 6min</i>	288	7.36	<i>time out</i>	<i>> 6min</i>	322	8.96	<i>time out</i>	<i>> 6min</i>	369	<i>failed</i>	<i>failed</i>	<i>failed</i>
Lucy	1.9M	1.84	89.17	101.01	43	8.02	<i>time out</i>	<i>> 6min</i>	228	9.45	<i>time out</i>	<i>> 6min</i>	255	11.29	<i>time out</i>	<i>> 6min</i>	294	<i>failed</i>	<i>failed</i>	<i>failed</i>
Cow	2.0M	5.58	144.04	159.62	46	8.41	<i>time out</i>	<i>> 8min</i>	140	16.38	<i>time out</i>	<i>> 8min</i>	220	25.84	<i>time out</i>	<i>> 8min</i>	342	<i>failed</i>	<i>failed</i>	<i>failed</i>
XYZ Dragon	2.4M	13.86	121.74	135.61	34	12.45	<i>time out</i>	<i>> 8min</i>	200	12.96	<i>time out</i>	<i>> 8min</i>	214	15.75	<i>time out</i>	<i>> 8min</i>	246	<i>failed</i>	<i>failed</i>	<i>failed</i>
Fertility	2.8M	14.14	150.77	164.91	36	13.15	<i>time out</i>	<i>> 10min</i>	200	15.48	<i>time out</i>	<i>> 10min</i>	217	19.17	<i>time out</i>	<i>> 10min</i>	246	<i>failed</i>	<i>failed</i>	<i>failed</i>



GravoTet

A Fast Multigrid Hierarchy Construction for Tetrahedral Meshes



Project page &
Supplementary code
marcelpadilla.com

- Fast mesh hierarchy construction
- Prioritized fast disk sampling
- Boundary first approach

- Near Delaunay Barycenter weights
- Fast total build + solving times
- Good MG convergence

Thank you for your attention! ❤️

Bonus Slides

That did not fit into the 15 min talk

Sparsity

Examples

Mesh	Method	#Vert N_l	#It Poisson	#It Biharm.	$\frac{\text{nnz}}{\text{row}}$ (avg/max)
Cylinder	Ours	310k; 38k; 3.9k; 428	6	38	3.50/4
	Shi06	310k; 82k; 17k; 3.5k; 738; 173	17	193	3.17/10
	AMG-RS	310k; 71k; 13k; 2.1k; 342	87	+346	2.06/8
	AMG-SA	310k; 11k; 143	64	+422	4.31/10
Spike Ball	Ours	829k; 101k; 10k; 1.2k; 310	9	61	3.44/4
	Shi06	829k; 216k; 45k; 9.2k; 2.0k; 523; 167	17	+407	3.11/11
	AMG-RS	829k; 190k; 34k; 5.5k; 968; 205	+285	+447	1.98/10
	AMG-SA	829k; 31k; 469	63	+504	4.65/12
Lucy	Ours	1.9M; 225k; 23k; 2.5k; 307	16	43	3.49/4
	Shi06	1.9M; 488k; 101k; 20k; 4.2k; 943; 224	20	+228	3.10/18
	AMG-RS	1.9M; 425k; 77k; 12k; 2.0k; 428	260	+255	2.02/10
	AMG-SA	1.9M; 68k; 820; 18	89	+294	4.18/13
Fertility	Ours	2.8M; 333k; 33k; 3.4k; 392	9	36	3.53/4
	Shi06	2.8M; 726k; 145k; 28k; 5.7k; 1.2k; 260	19	+200	3.11/17
	AMG-RS	2.8M; 633k; 113k; 18k; 2.8k; 536; 152	+146	+217	1.95/9
	AMG-SA	2.8M; 99k; 1.0k; 14	86	+246	4.01/12

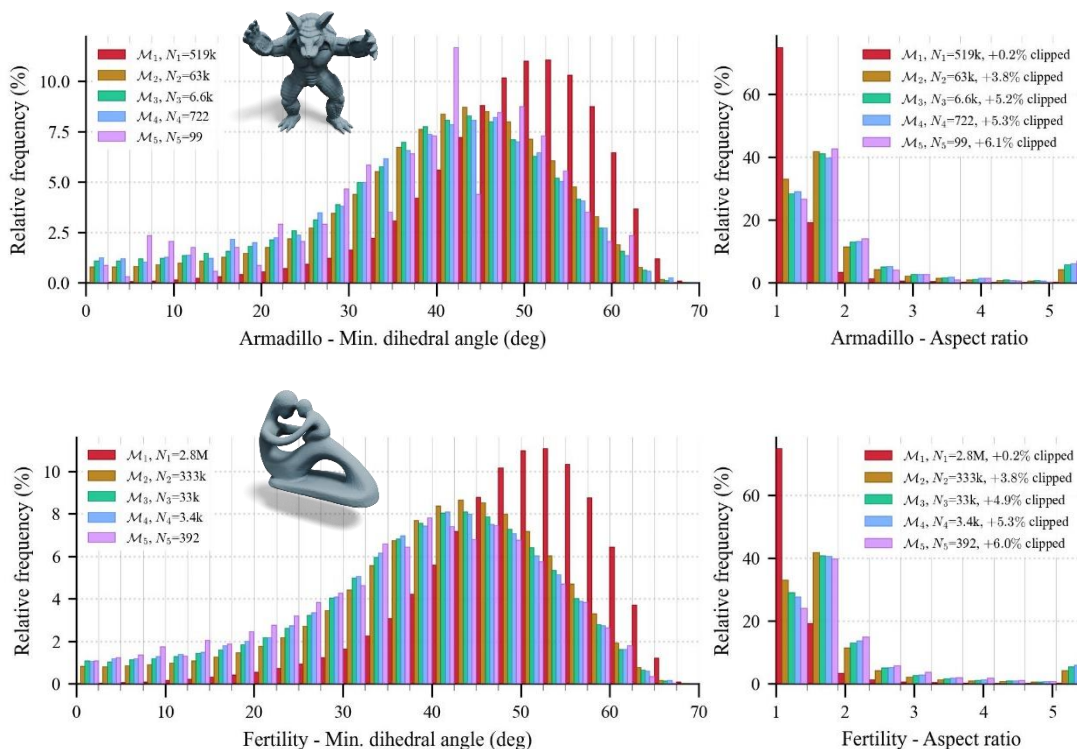
 P_l has at most 4 non-zero entries per row.

Hierarchy Quality

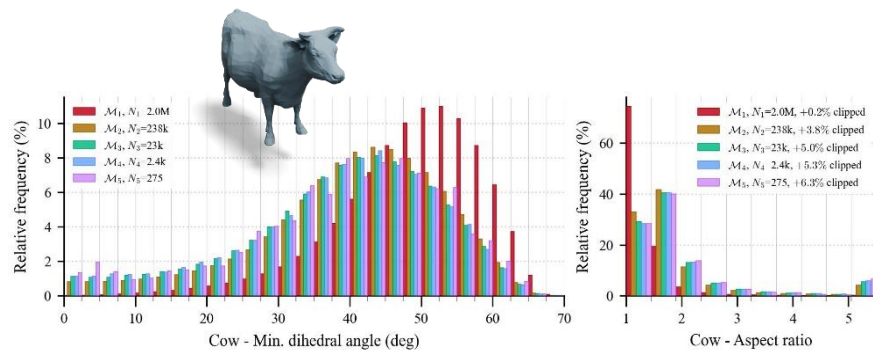
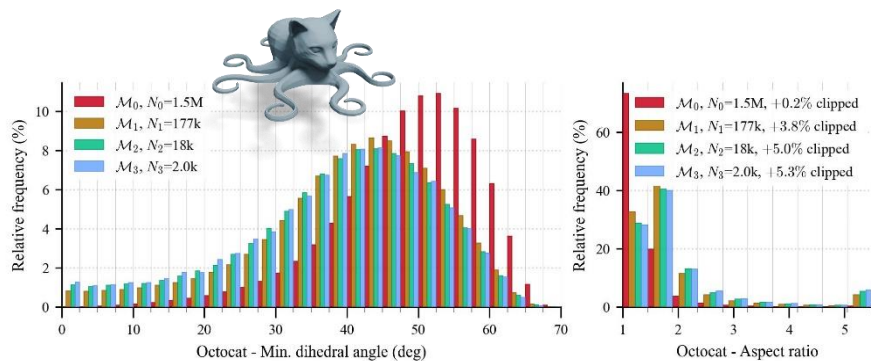
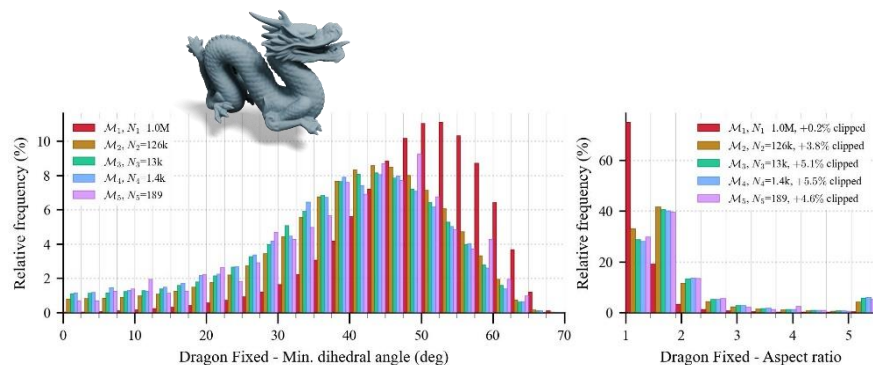
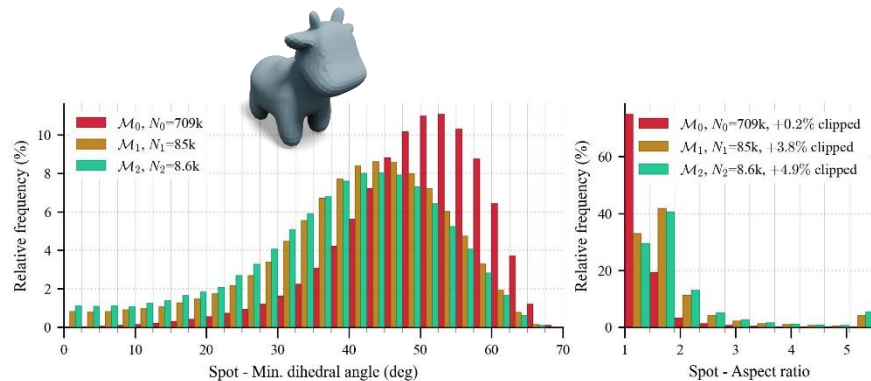
Low quality Tets
are not a problem.

- Barycenter coordinates
for propagation work
fine! 👍

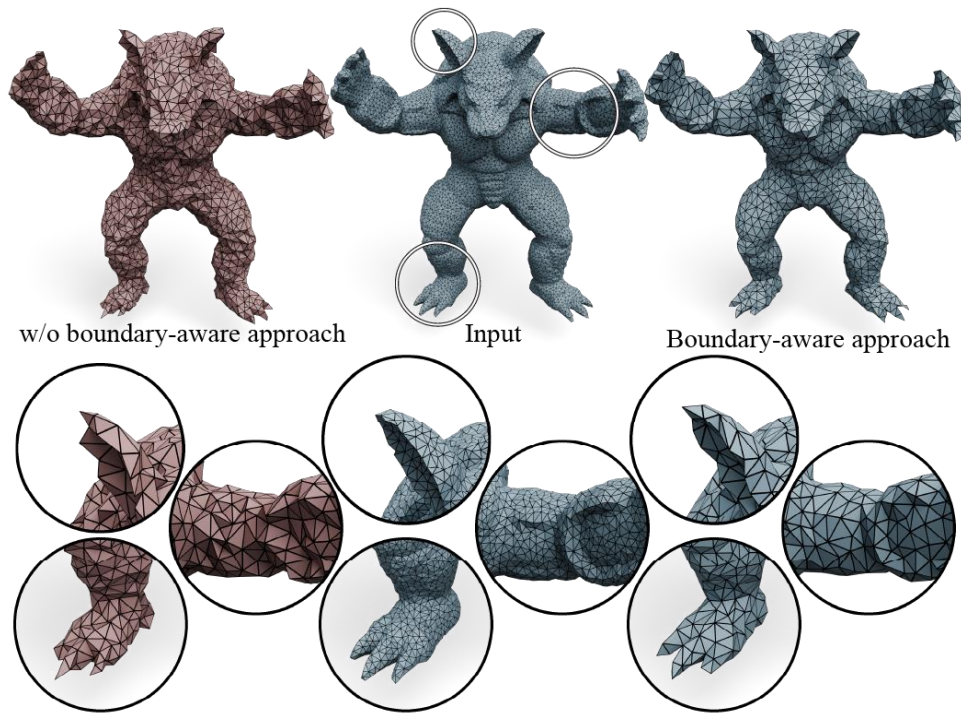
Red = input tet mesh



Hierarchy Quality



Ablation Study

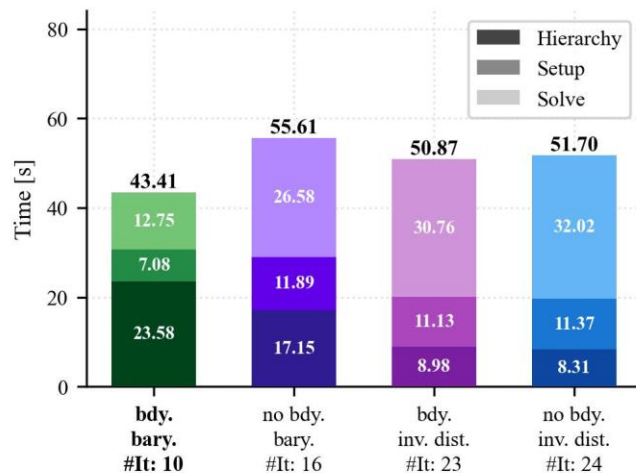
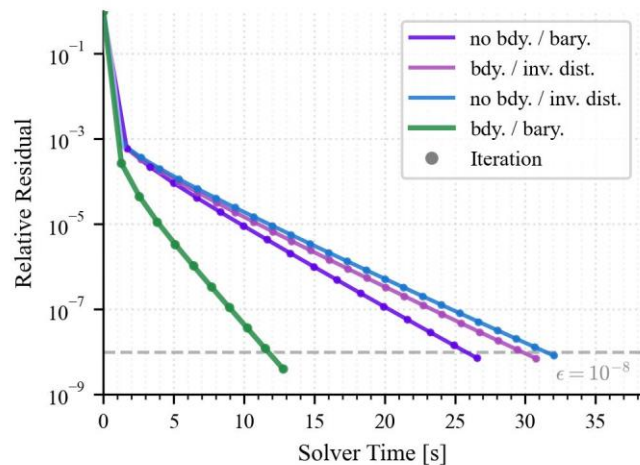


We vary:

- [Shi et. al. 2006]
 - Graph-based method
 - No-tetrahedralization (faster build)
 - Uses inv. dist weights
- Compare without boundary handling

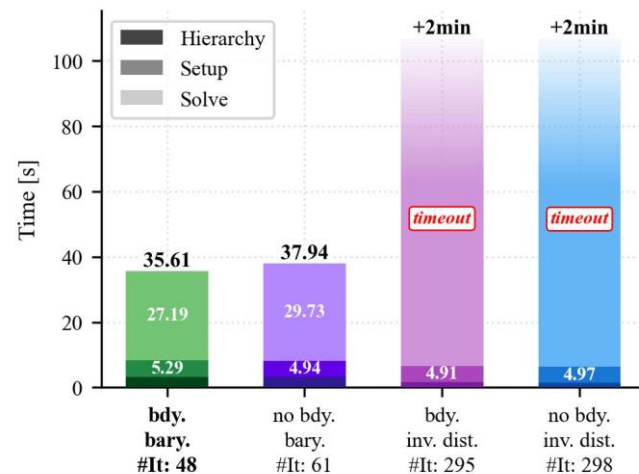
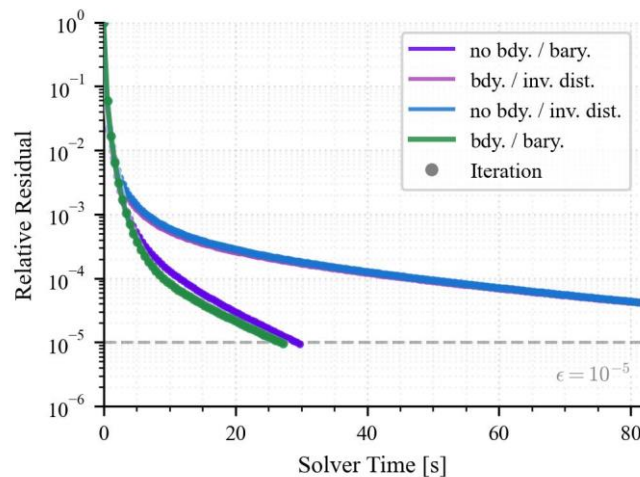
Ablation Study

2M vertices. Poisson problem



Ablation Study

709k vertices. Biharmonic problem



Multigrid methods

AMG

Algebraic Multigrid Methods

Use matrix connectivity only

- Fast to build
- Versatile
- Slow to converge



Based purely on matrix values

VS.

Only differ by 🤪
prolongation matrix P_l

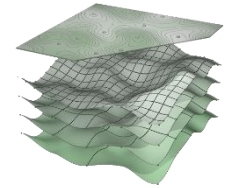
„Quality“ of P_l ✨
determines convergence

GMG

Geometric Multigrid Methods

Use Geometric Information

- Slower to build
- Less Versatile
- Faster to converge



Using mesh information. Distances, coordinates, mesh connectivity.

<https://hpc.uni-wuppertal.de/en/research/topics/multigrid-methods/>

Experiment Setups

Poisson problem

$$S x = M y$$

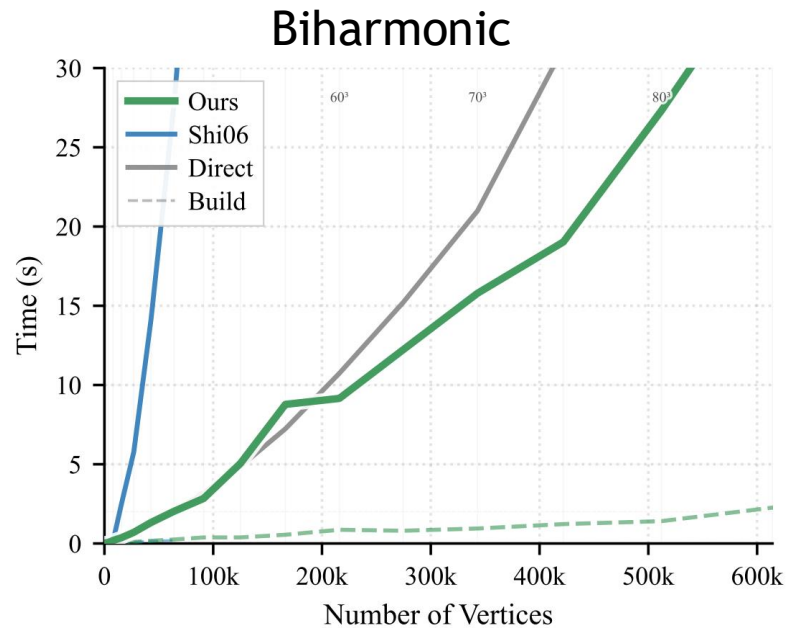
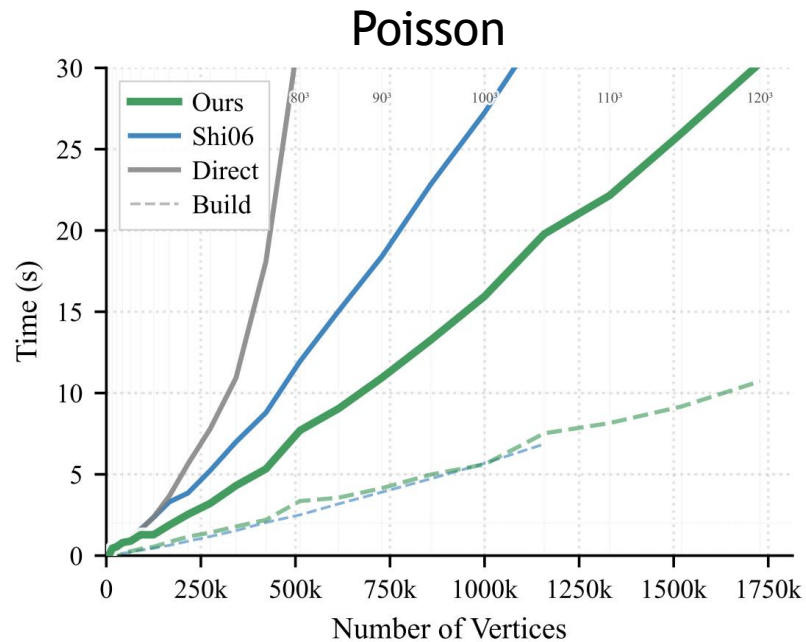
Biharmonic problem

$$S M^{-1} S x = M y$$

Stopping criteria: $\|S x - M y\|_{M^{-1}} < \epsilon \|M y\|_{M^{-1}}$

Complexity

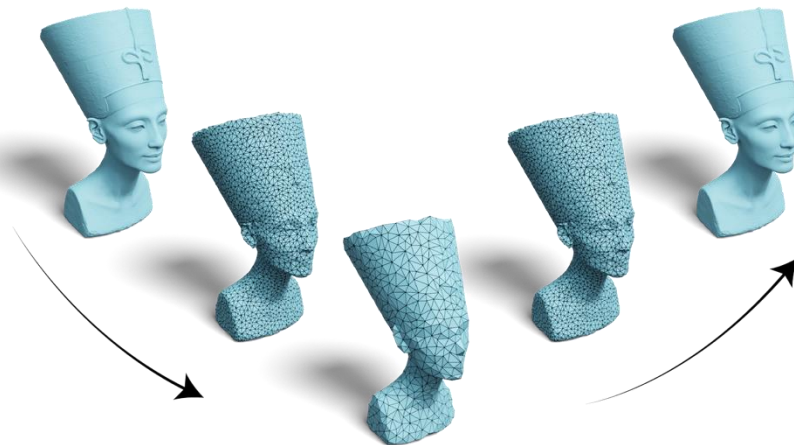
Cubes of increasing resolutions n^3



GravoTet

Most related paper ❤️

A Fast Geometric Multigrid Method for Curved Surfaces



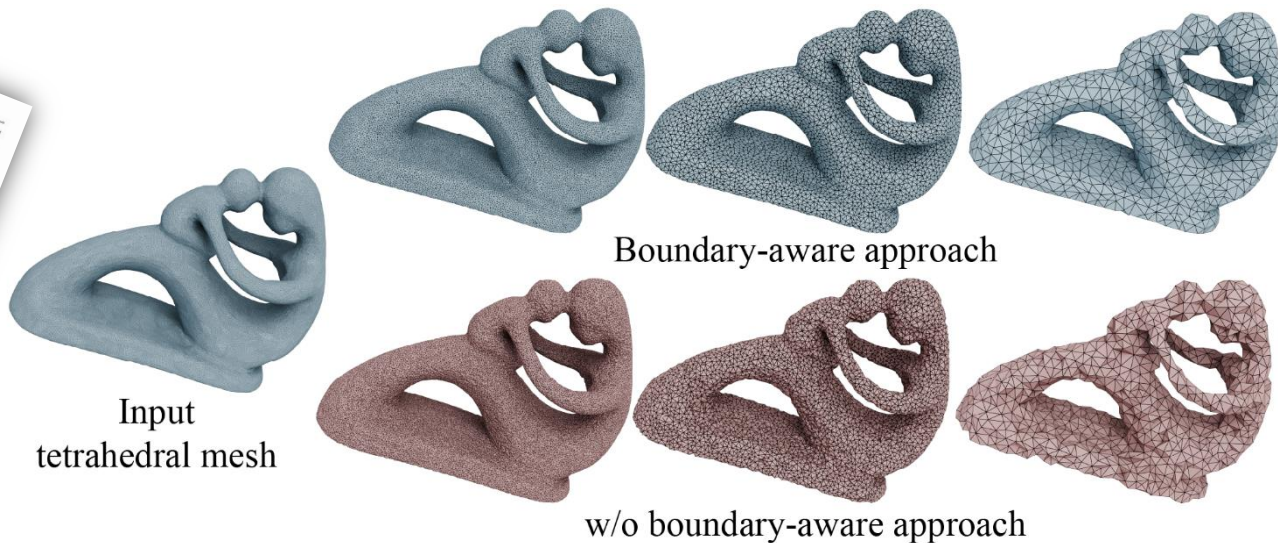
⚠️ Fast disk sampling + Delaunay approximation, but ONLY on surfaces! ⚠️

🧠 Transfer the logic to tetrahedra + careful boundary handling 🧠

GravoTet

Most related paper ❤️

A Fast Geometric Multigrid Method for Curved Surfaces



🧠 Transfer the logic to tetrahedra + solve the emerging problems 🧠