Maximally smooth splines on triangulations

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Joint work with T. Lyche and C. Manni



Goal



• Build smooth splines on arbitrary (possibly refined) triangulations

- Equip them with a good local basis
- Have efficient algorithms for their manipulation

Splines on triangulations



- Let \mathcal{T}_0 be a triangulation of a polygonal domain $\Omega \in \mathbb{R}^2$
- A spline space on \mathcal{T}_0 :

$$\mathbb{S}_p^r(\mathcal{T}_0) := \{ f \in C^r(\Omega) : f_{|\Delta} \in \mathbb{P}_p, \ \forall \ \Delta \in \mathcal{T}_0 \}$$

with $\mathbb{P}_p :=$ space of polynomials of degree $\leq p$

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• Practical request: stable dimension & local construction

A stable dimension only depends on degree, smoothness, topology (# vertices, edges, triangles in T_0)

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Morgan–Scott triangulation

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Lower Bound $\leq \dim(\mathbb{S}_p^r(\mathcal{T}_0)) \leq \text{Upper Bound}$

L. Schumaker, Bounds on the dimension of spaces of multivariate piecewise polynomials, Rocky Mnt. Math., 1984 A. Ibrahim, L. Schumaker, Super spline spaces of smoothness r and degree $d \ge 3r + 2$, Constr. Approx., 1991

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Lower Bound = dim($\mathbb{S}_p^r(\mathcal{T}_0)$) if $p \ge 3r + 2$

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 $\mathsf{dim}(\mathbb{S}_3^1(\mathcal{T}_0)) = ???$

L. Schumaker, Bounds on the dimension of spaces of multivariate piecewise polynomials, Rocky Mnt. Math., 1984 A. Ibrahim, L. Schumaker, Super spline spaces of smoothness r and degree $d \ge 3r + 2$, Constr. Approx., 1991 Why smooth splines of low degrees?

- Smoother splines give the same approximation order as less smooth splines of the same degree, using fewer degrees of freedom
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Single element construction (finite element):

Degree 4r + 1 for C^r : $\rightarrow \mathbb{S}_5^1$ (Argyris), \mathbb{S}_9^2 , \mathbb{S}_{13}^3 , ...

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Solution: consider refined triangulations

Triangulation with subpatches



A splitting \mathcal{T}_1 of each triangle in \mathcal{T}_0 into subpatches:

$$\mathbb{S}_p^r(\mathcal{T}_1) := \{ f \in C^r(\Omega) : f_{|T} \in \mathbb{P}_p, \ \forall \ T \in \mathcal{T}_1 \}$$

M.J. Lai and L.L. Schumaker, Spline Functions on Triangulations, Cambridge University Press, 2007

Triangulation with subpatches: popular splits



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Triangulation with subpatches: Wang-Shi splits

 WS_p -split: complete graph of p + 1 uniform points on each edge



R.H. Wang and X.Q. Shi, $S^{\mu}_{\mu+1}$ surface interpolations over triangulations, in: Approximation, Optimization and Computing: Theory and Applications, Elsevier Science Publishers, pp. 205–208, 1990

Triangulation with subpatches: Wang-Shi splits

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- $\mathbb{S}_{p}^{p-1}(\Delta_{\mathrm{WS}_{p}})$ on such partition $\Delta_{\mathrm{WS}_{p}}$
- cross-cut partitions

R.H. Wang and X.Q. Shi, $S^{\mu}_{\mu+1}$ surface interpolations over triangulations, in: Approximation, Optimization and Computing: Theory and Applications, Elsevier Science Publishers, pp. 205–208, 1990

Dimension formula

On a cross-cut partition Δ_c of a simply connected domain in \mathbb{R}^2 with m interior cross cuts, we have $\dim \mathbb{S}_p^{p-1}(\Delta_c) = \dim \mathbb{P}_p + m, \ p \in \mathbb{N}$ provided at most p + 1 lines cross at each interior vertex



WS_p-split: m = 3p(p-1) cross cuts

T. Lyche, C. Manni, and H. Speleers, Construction of C^2 cubic splines on arbitrary triangulations, Found. Comput. Math., 22:1309–1350, 2022

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Dimension formula: local and global

- Dimension comparisons with no split Δ :
 - $\dim(\mathbb{S}^1_2(\mathbb{A})) = 12 \quad \Leftrightarrow \quad \dim(\mathbb{S}^1_5(\Delta)) = 21$
 - dim($\mathbb{S}_3^2(\mathbb{A})$) = 28 \Leftrightarrow dim($\mathbb{S}_9^2(\mathbb{A})$) = 55

• dim(
$$\mathbb{S}_4^3(\mathbb{A})$$
) = 51 \Leftrightarrow dim($\mathbb{S}_{13}^3(\Delta)$) = 105

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- dim $(\mathbb{S}_4^3(\mathbf{A})) = 51 \quad \Leftrightarrow \quad \dim(\mathbb{S}_{13}^3(\mathbf{A})) = 105$
- Degrees of freedom for Δ_{WS_p}:



- $\dim(\mathbb{S}_{3}^{2}(\mathcal{T}_{1})) = 6n_{v} + 3n_{e} + n_{t}$
- $\dim(\mathbb{S}_4^3(\mathcal{T}_1)) = 10n_v + 6n_e + 3n_t$

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Macro-triangles: many subpatches...



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The set of Bernstein polynomials are defined by

$$B_{i,j,k}(u,v,w) = \frac{p!}{i!j!k!}u^iv^jw^k, \quad i+j+k=p$$

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They form a basis for the polynomial space \mathbb{P}_p :

$$g \in \mathbb{P}_p \quad \Rightarrow \quad g(u, v, w) = \sum_{i+j+k=p} c_{i,j,k} B_{i,j,k}(u, v, w)$$

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Properties of Bernstein polynomials:

- nonnegative partition of unity
- differentiation formula, recurrence relation
- domain points and control points



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• simple conditions for smooth joins to neighboring triangles



Building a global basis on a triangulation using the MDS principle:

A minimal determining set (MDS) is a set with the minimal number of domain points such that the corresponding coefficients equal to zero give the zero function

- determine all smoothness conditions
- determine all independent control points

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We would like a B-spline like basis for $\mathbb{S}_p^{p-1}(\Delta_{\mathrm{WS}_p})$:

- Iocal support
- nonnegative partition of unity
- differentiation formula, recurrence relation
- Marsden-like identity: explicit representation of polynomials

 \Rightarrow can be used to build dual functionals and quasi-interpolants

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• simple conditions for smooth joins to neighboring triangles \Rightarrow can be used to build a global MDS basis

Try simplex splines (multivariate B-splines)

C.A. Micchelli, On a numerically efficient method for computing multivariate B-splines, in: Multivariate Approximation Theory, Birkhäuser, pp. 211–248, 1979
W. Dahmen, On multivariate B-splines, SIAM J. Numer. Anal., 17:179–191, 1980

Simplex lifting



- Given a sequence of n+1 points $\Xi := \{ \boldsymbol{\xi}_1, \dots, \boldsymbol{\xi}_{n+1} \}$ in \mathbb{R}^s
- Assume nondegenerate $\langle \Xi \rangle$: $vol_s(\langle \Xi \rangle) > 0$
- *ξ*₁,..., *ξ*_{n+1} points in ℝⁿ whose projection π : ℝⁿ → ℝ^s onto the first s coordinates satisfies π(*ξ_i*) = *ξ_i* for *i* = 1,..., n + 1.
- The simplex $\sigma := \langle \overline{\xi}_1, \dots, \overline{\xi}_{n+1} \rangle$ has positive volume

Simplex splines: geometric definition

•
$$\equiv \{\xi_1, \dots, \xi_{n+1}\} \in \mathbb{R}^s \text{ (knots)}$$

• $\sigma := \langle \overline{\xi}_1, \dots, \overline{\xi}_{n+1} \rangle \in \mathbb{R}^n \text{ (lifted simplex)}$
• $p := n - s \ge 0 \text{ (degree)}$
 $M_{\equiv} : \mathbb{R}^s \to \mathbb{R}, \quad M_{\equiv}(\mathbf{x}) := \begin{cases} \frac{\operatorname{vol}_p(\sigma \cap \pi^{-1}(\mathbf{x}))}{\operatorname{vol}_n(\sigma)}, & \text{if } \operatorname{vol}_s(\langle \Xi \rangle) > 0 \\ 0, & \text{otherwise} \end{cases}$



Simplex splines: properties

- Knot dependence: M_Ξ only depends on Ξ; in particular, it is independent of the choice of σ and the ordering of the knots
- Nonnegativity: M_Ξ is a nonnegative piecewise polynomial of total degree p and support (Ξ)
- Normalization: M_≡ has unit integral
- The ABC recurrence relations (n = p + s):
 - Differentiation formula (A-recurrence): For any $\boldsymbol{u} \in \mathbb{R}^{s}$ $(\boldsymbol{u} \cdot \nabla)M_{\Xi} = (\boldsymbol{p} + s) \sum_{i=1}^{\boldsymbol{p}+s+1} a_{i}M_{\Xi \setminus \boldsymbol{\xi}_{i}}, \quad \sum_{i} a_{i}\boldsymbol{\xi}_{i} = \boldsymbol{u}, \ \sum_{i} a_{i} = 0$
 - Recurrence relation (B-recurrence): For any $\mathbf{x} \in \mathbb{R}^{s}$ $M_{\Xi}(\mathbf{x}) = \frac{p+s}{p} \sum_{i=1}^{p+s+1} b_i M_{\Xi \setminus \boldsymbol{\xi}_i}(\mathbf{x}), \quad \sum_i b_i \boldsymbol{\xi}_i = \mathbf{x}, \ \sum_i b_i = 1$
 - Knot insertion formula (C-recurrence): For any $\mathbf{y} \in \mathbb{R}^{s}$ $M_{\Xi} = \sum_{i=1}^{p+s+1} c_{i} M_{\Xi \cup \mathbf{y} \setminus \boldsymbol{\xi}_{i}}, \quad \sum_{i} c_{i} \boldsymbol{\xi}_{i} = \mathbf{y}, \ \sum_{i} c_{i} = 1$

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Simplex splines: univariate case

s = 1

 M_Ξ = univariate B-spline of degree p with knots Ξ normalized to have integral one in the nondegenerate case



Simplex splines: bivariate case

s = 2

The lines in the complete graph of Ξ are called knot lines, providing a partition of $\langle \Xi \rangle$ into polygonal regions

• The simplex spline M_{Ξ} is a polynomial of degree

 $p = \#\Xi - 3$

in each region of this partition

Across a knot line:

 $M=\in C^{p+1-\mu}$

 $\mu =$ number of knots on that knot line, including multiplicities

• At any boundary line: zero or univariate B-spline

Simplex splines: cubic example, p = 3, s = 2



• p + s + 1 = 6 knots with double knot at vertex **201**

- Across horizontal boundary line: $C^{p+1-\mu} = C^{4-5} = C^{-1}$
- Univariate cubic B-spline restricted to that line
- $C^{p+1-\mu} = C^{4-3} = C^1$ across left boundary line
- Across remaining knot lines: $C^{p+1-\mu} = C^{4-2} = C^2$

C^1 quadratics



A nonnegative partition of unity (scaled) simplex spline basis

B_1, \ldots, B_{12}

E. Cohen, T. Lyche, and R.F. Riesenfeld, A B-spline-like basis for the Powell–Sabin 12-split based on simplex splines, Math. Comput., 82:1667–1707, 2013

C^2 cubics



A nonnegative partition of unity (scaled) simplex spline basis

$$B_1, \ldots, B_{28}$$

T. Lyche, C. Manni, and H. Speleers, Construction of C^2 cubic splines on arbitrary triangulations, Found. Comput. Math., 22:1309–1350, 2022

C^3 quartics



A nonnegative partition of unity (scaled) simplex spline basis

$$B_1,\ldots,B_{51}$$

T. Lyche, C. Manni, and H. Speleers, A local simplex spline basis for C³ quartic splines on arbitrary triangulations, Appl. Math. Comput., 462:128330, 2024

C^2 cubics: details of construction



A nonnegative partition of unity (scaled) simplex spline basis

$$B_1, \ldots, B_{28}$$

T. Lyche, C. Manni, and H. Speleers, Construction of C^2 cubic splines on arbitrary triangulations, Found. Comput. Math., 22:1309–1350, 2022

C^2 cubics: construction of B_1, \ldots, B_9

 B_1, \ldots, B_9 related to value and first derivatives at vertices



C^2 cubics: construction of B_{10}, \ldots, B_{18}

 B_{10}, \ldots, B_{18} related to second derivatives at vertices



C^2 cubics: construction of B_{19}, \ldots, B_{27}

 B_{19}, \ldots, B_{27} related to first and second derivatives across edges



C^2 cubics: construction of B_{28}

B_{28} related to interior value



C^{p-1} splines of degree *p*: properties

Properties of the (scaled) simplex spline basis p = 2, 3, 4:

- Basis: they are linearly independent on $\Delta \Rightarrow$ basis of $\mathbb{S}_p^{p-1}(\Delta_{\mathrm{WS}_p})$
- Nonnegativity: they form a nonnegative partition of unity
- Classical B-splines when restricted to boundary
- Simplex recurrence relations for their manipulation
- Marsden-like identity: representation of polynomials

$$(1+oldsymbol{y}^{\mathsf{T}}oldsymbol{x})^{p}=\sum_{i}\psi_{i}(oldsymbol{y})B_{i}(oldsymbol{x}),\quadoldsymbol{y}\in\mathbb{R}^{2},\quadoldsymbol{x}\in\Delta$$

with $\psi_i(\mathbf{y}) := \prod_{j=1}^p (1 + \mathbf{y}^T \mathbf{r}_{i,j})$ for almost all i

• They can be extended in a Bernstein-Bézier fashion to compute smooth surfaces on arbitrary triangulations

Domain points and control net for p = 3



Domain points and a possible control net for p = 3

The control mesh is at a distance $O(h^2)$ from the surface where *h* is the longest side of the triangle

Smoothness across an edge for p = 3



 C^0, C^1, C^2 smoothness conditions analogous to the Bernstein representation in triangular polynomial case

Smoothness across an edge for p = 3



 ${\cal C}^1$ conditions in the ${\cal C}^2$ cubic case

Conclusions



- The WS_p-splits, p = 2, 3, 4 allow to locally construct $C^1/C^2/C^3$ quadratic/cubic/quartic splines on any triangulation
- They seem extremely complicated, but
 - the computation can be done in a Bernstein–Bézier fashion using a simplex spline basis on each macro-triangle which forms a nonnegative partition of unity
 - for their manipulation one can exploit the features of simplex splines (recurrence relations)

Conclusions



- The WS_p-splits, p = 2, 3, 4 allow to locally construct $C^1/C^2/C^3$ quadratic/cubic/quartic splines on any triangulation
- Local approximation methods can be developed by exploiting Marsden-like identity
- Tailored quadrature rules can be constructed by exploiting the inter-element maximal smoothness
 - 4 nodes suffice for integration of C^1 quadratics
 - 10 nodes suffice for integration of C^2 cubics

References

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- S. Eddargani, T. Lyche, C. Manni, and H. Speleers, Quadrature rules for C¹ quadratic spline finite elements on the Powell-Sabin 12-split, Comput. Methods Appl. Mech. Eng., 430:117196, 2024

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Announcement

SIAM Conference on Computational Geometric Design

July 28–30, 2025 Montréal Convention Center Montréal, Québec, Canada

https://www.siam.org/conferences-events/siam-conferences/gd25/



Keynote speakers

Henry Bucklow (ITI CADfix), Géraldine Morin (U Toulouse), Helmut Pottman (TU Wien), Alla Sheffer (U British Columbia), Wenping Wang (Texas A&M)

Deadline dates

Minisymposium proposal: January 13, 2025 Abstract submission: January 27, 2025