

(T)HB- AND PATCHWORK B-SPLINES



Nora Engleitner

Institute of Applied Geometry, Johannes Kepler University
MTU Aero Engines AG, Munich



(T)HB-SPLINES



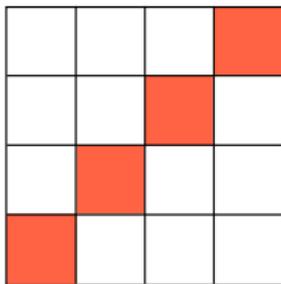
(T)HB-SPLINES



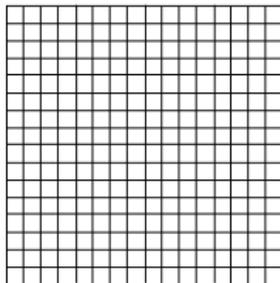
INTRODUCTION

Local spline refinement

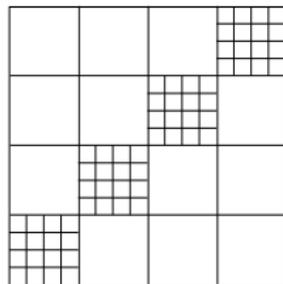
Problem: Classical tensor-product B-splines do not allow local refinement.



Task: Knot refinement in the marked areas.



Resulting mesh for B-splines.



How can we achieve a mesh like this?

Existing constructions

T-splines (Sederberg et al. 2003):

tensor-product B-splines defined on a mesh with T-junctions

PHT-splines (Falai Chen, Jiansong Deng 2008):

algebraically complete basis for splines on a mesh with T-junctions

HB-splines, THB-splines (Kraft 1997, Giannelli et al. 2012):

obtained by selecting B-splines from different levels in a hierarchy

LR-splines (Dokken et al. 2010):

constructed by repeatedly splitting tensor-product B-splines

This talk focuses on *HB-splines*.

(T)HB-SPLINES



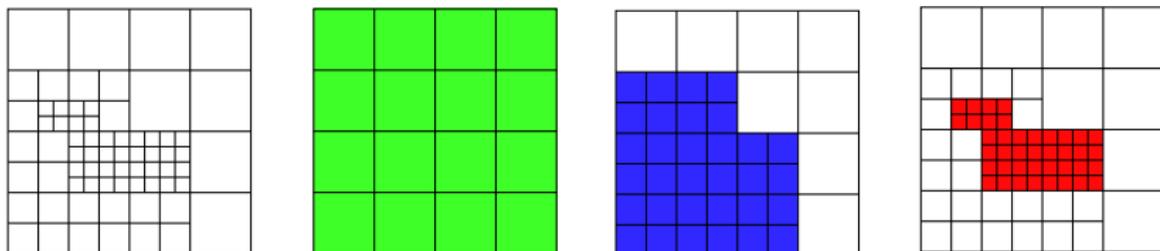
A HIERARCHICAL B-SPLINE BASIS

Hierarchical B-splines

Consider a finite sequence of

- nested spline spaces, $V^0 \subseteq V^1 \subseteq \dots \subseteq V^N$, with $V^\ell = \text{span}B^\ell$,
- corresponding nested domains, $\Omega = \Omega^0 \supseteq \Omega^1 \supseteq \dots \supseteq \Omega^N$.

The index ℓ is called *level*.



A hierarchical mesh and the domains Ω^0 (green), Ω^1 (blue) and Ω^2 (red).

Kraft's selection mechanism

$$\text{supp}f = \{\mathbf{x} : f(\mathbf{x}) \neq 0 \text{ and } \mathbf{x} \in \Omega^0\}$$

Recursive construction of HB-splines

1) Initialization: $H^0 = \{\beta \in B^0 : \text{supp}\beta \neq \emptyset\}$

2) Recursion: $H^{\ell+1} = H_A^{\ell+1} \cup H_B^{\ell+1}$, for $\ell = 0, \dots, N - 1$, with

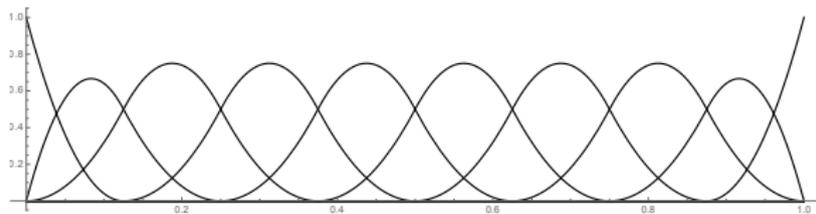
$$H_A^{\ell+1} = \{\beta \in H^\ell : \text{supp}\beta \not\subseteq \Omega^{\ell+1}\},$$

and

$$H_B^{\ell+1} = \{\beta \in B^{\ell+1} : \text{supp}\beta \subseteq \Omega^{\ell+1}\}$$

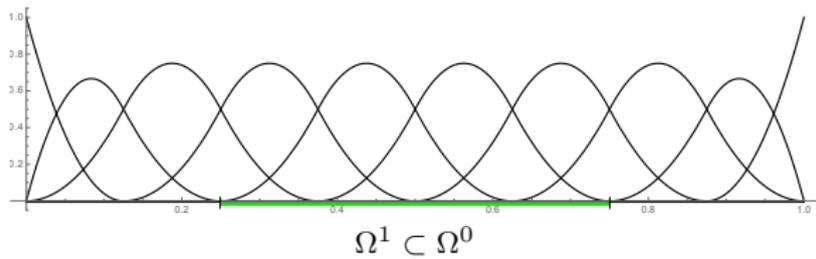
3) $H = H^N$

Hierarchical B-splines

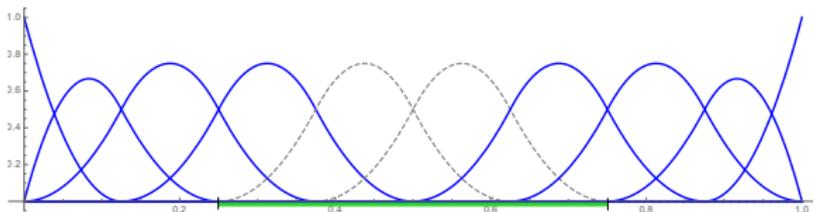


1) Initialization: $H^0 = B^0$

Hierarchical B-splines

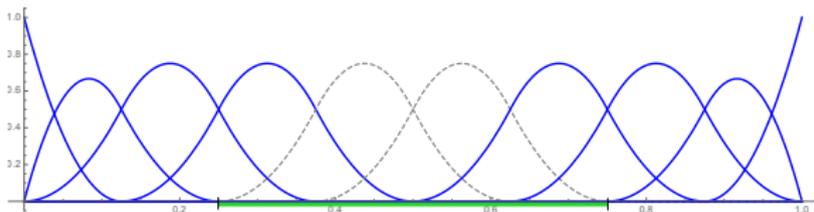


Hierarchical B-splines

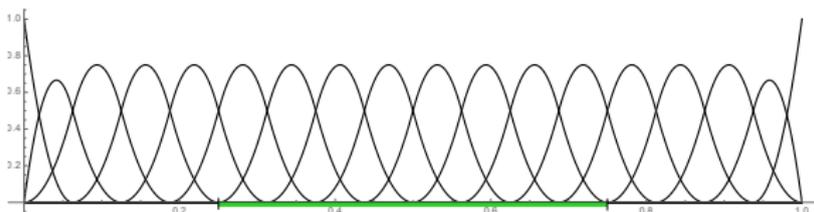


2a) Recursion: $H_A^1 = \{\beta \in H^0 = B^0 : \text{supp}\beta \not\subseteq \Omega^1\}$

Hierarchical B-splines

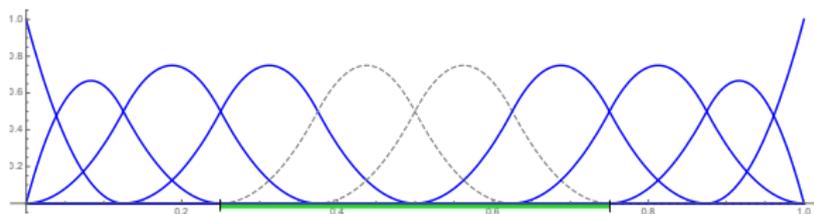


Selected B-splines of level 0

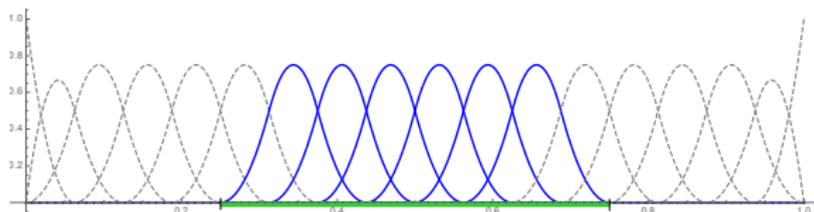


B-splines B^1 on Ω^0

Hierarchical B-splines

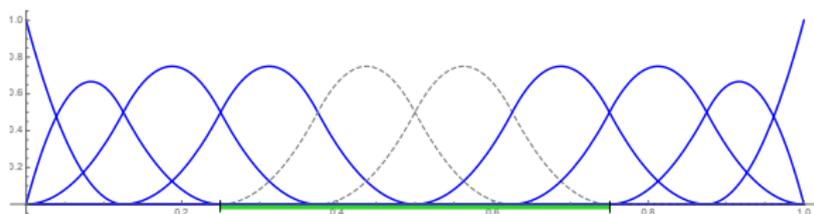


Selected B-splines of level 0

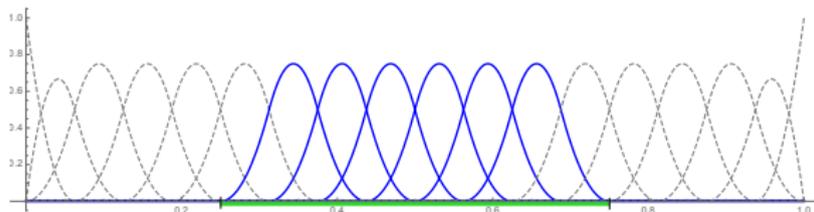


2b) Recursion: $H_B^1 = \{\beta \in B^1 : \text{supp}\beta \subseteq \Omega^1\}$

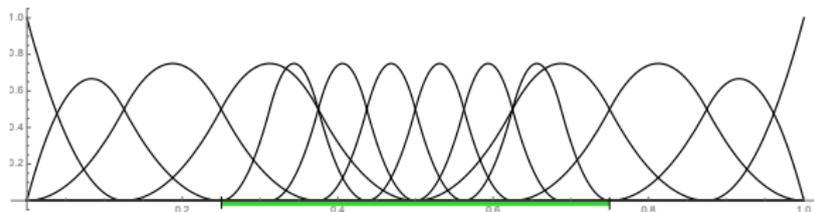
Hierarchical B-splines



Selected B-splines of level 0



Selected B-splines of level 1



3) Resulting hierarchical B-splines $H = H_A^1 \cup H_B^1$

(T)HB-SPLINES



TRUNCATION

Restoring partition of unity

HB-splines: no partition of unity \rightarrow solution: **truncation mechanism**
(cf. Giannelli et al. 2012)

Refinement relation: For $f \in V^\ell$ we have $f = \sum_{\beta \in B^{\ell+1}} c_\beta^{\ell+1}(f)\beta$.

Truncation:

$$\text{trunc}^{\ell+1} f = \sum_{\beta \in B^{\ell+1}, \text{supp}\beta \not\subseteq \Omega^{\ell+1}} c_\beta^{\ell+1}(f)\beta.$$

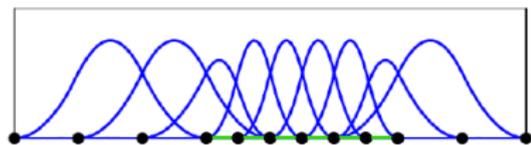
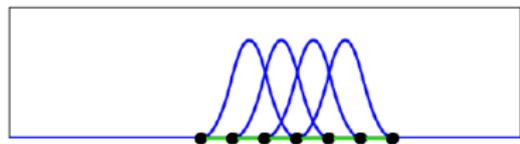
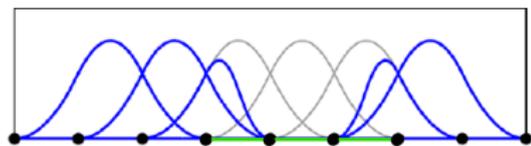
Truncated hierarchical B-spline basis:

- 1) Initialization: $T^0 = H^0$
- 2) Recursion: $T^{\ell+1} = T_A^{\ell+1} \cup T_B^{\ell+1}$, for $\ell = 0, \dots, N-1$, with

$$T_A^{\ell+1} = \{\text{trunc}^{\ell+1} \tau : \tau \in T^\ell \text{ and } \text{supp}\tau \not\subseteq \Omega^{\ell+1}\}, \quad \text{and} \quad T_B^{\ell+1} = H_B^{\ell+1}$$

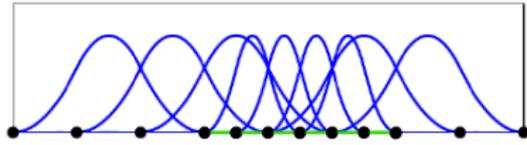
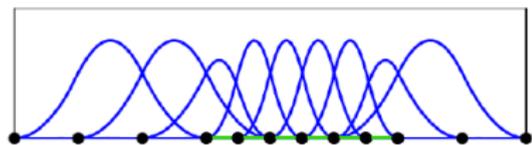
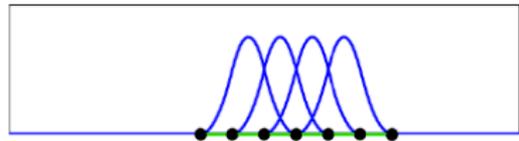
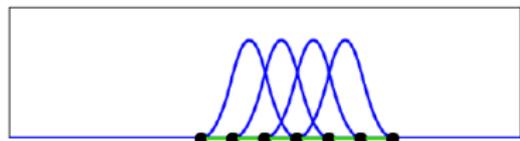
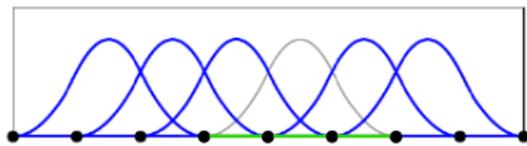
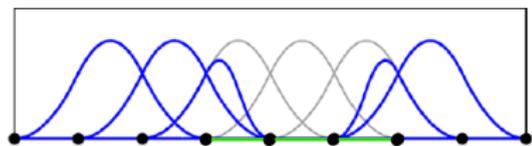
- 3) $T = T^N$

Comparing THB- and HB-splines



THB-splines

Comparing THB- and HB-splines



THB-splines

HB-splines

(T)HB-SPLINES



PROPERTIES

Properties of (T)HB-splines

HB-splines:

- non-negativity
- linear independence
- under certain assumptions:

$$\text{span}H = \mathcal{H} = \{h : \Omega^0 \rightarrow \mathbb{R} : h|_{\Omega^0 \setminus \Omega^{\ell+1}} \in \mathcal{S}^{\ell}(M^{\ell})\}$$

Additionally for THB-splines:

- $\text{span}H = \text{span}T$
- preservation of coefficients
- partition of unity
- strongly stable under supremum norm

Quasi-interpolant for (T)HB-splines

References: Speleers et al. 2015, Speleers 2016

A **one-level quasi-interpolant** $\Pi^\ell : \mathcal{V}(\Omega^0) \mapsto V^\ell$

$$\Pi^\ell f = \sum_{i=1}^{n_\ell} \lambda_i^\ell(f) \beta_i^\ell, \quad \ell = 0, \dots, N.$$

λ_i^ℓ is supported on Λ_i^ℓ if $f|_{\Lambda_i^\ell} = 0 \Rightarrow \lambda_i^\ell(f) = 0$. For a cell Q^ℓ in $\Omega^\ell \setminus \Omega^{\ell+1}$ define

$$\Lambda_{Q^\ell} = \text{conv} \left(\bigcup_{(i,\ell): \text{supp} \tau_i^\ell \cap Q^\ell \neq \emptyset} \Lambda_i^\ell \cup Q^\ell \right).$$

Hierarchical quasi-interpolant $\Pi : \mathcal{V}(\Omega^0) \mapsto \mathcal{H}$

$$\Pi f := \sum_{\ell=0}^N \sum_{\tau_i^\ell \in T} \lambda_i^\ell(f) \tau_i^\ell,$$

where $\tau_i^\ell = \text{trunc}^N (\text{trunc}^{N-1} \dots (\text{trunc}^{\ell+1} \beta_i^\ell) \dots)$.

Quasi-interpolant for (T)HB-splines

Representation in terms of HB-splines (using telescoping argument):

Theorem: Π^ℓ and Π as defined before. If $\Pi^\ell s = s$ for all $s \in V^\ell$ then

$$\Pi f = \sum_{\ell=0}^N f^{(\ell)},$$

with

$$f^{(0)} = \sum_{\beta_i^0 \in H} \lambda_i^0 \beta_i^0, \quad f^{(\ell)} = \sum_{\beta_i^\ell \in H} \lambda_i^\ell (f - f^{(0)} - f^{(1)} - \dots - f^{(\ell-1)}) \beta_i^\ell.$$

Error estimate:

$$\|D^\alpha (f - \Pi f)\|_{L^2(Q^\ell)} \leq Ch_\ell^{s-|\alpha|} |f|_{H^s(\Lambda_{Q^\ell})}.$$

(T)HB-SPLINES



SUMMARY

Summary

- Selection mechanism for hierarchical B-splines
- Restoring partition of unity with truncation mechanism
- (T)HB-splines have nice mathematical properties
- (T)HB-splines are a basis for the hierarchical spline space
- Quasi-interpolant and local approximation estimate

PATCHWORK B-SPLINES

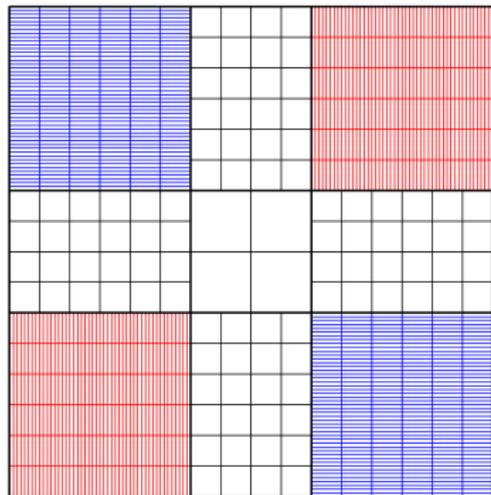
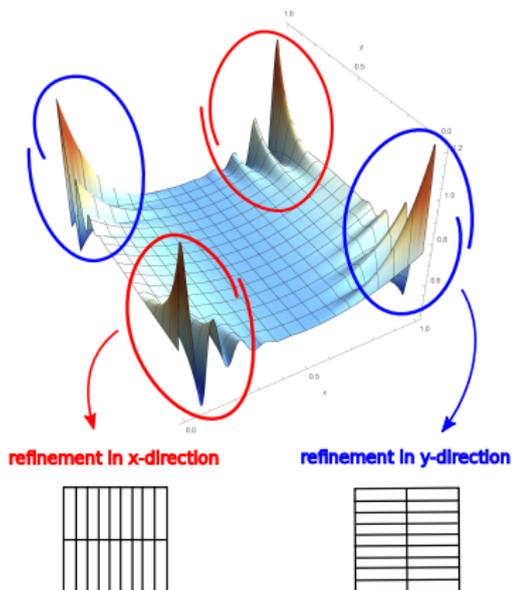


PATCHWORK B-SPLINES



INTRODUCTION

Motivation



Independent refinement strategies \leadsto cannot be achieved with HB-splines
 \leadsto hierarchical refinement leads to redundant dof

Motivation

State of the art: Hierarchical B-splines that use sequences of *nested* spline spaces, $V^0 \subseteq V^1 \subseteq \dots \subseteq V^N$.

Limitation: Independent refinement strategies are not possible.

Possible application of independent refinement strategies:

- Modeling: designing objects with creases or similar features.
- IGA: using different refinement techniques (e.g., h - and p -refinement) in different parts of the domain.

Goal: Generalization of the selection mechanism for hierarchical B-splines to obtain sequences of *partially nested* hierarchical spline spaces, that use spline spaces such as $V^0 \subseteq V^1 \not\subseteq V^2 \subseteq V^3 \dots$

Preliminaries

We consider:

- A finite sequence of bivariate tensor-product spline spaces:

$$V^\ell = \text{span}B^\ell, \quad \ell = 1, \dots, N.$$

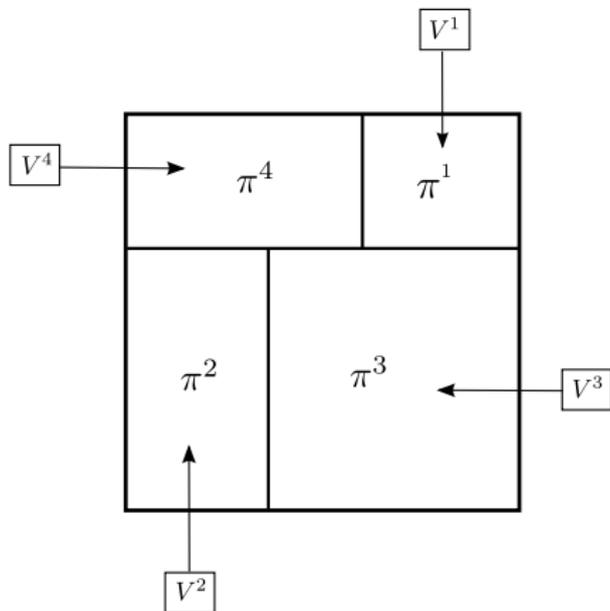
- Note: V^ℓ not necessarily subspace of $V^{\ell+1}$
- For simplicity: $d = 2$, uniform degrees, maximum smoothness

- An associated sequence of open sets

$$\pi^\ell \subseteq (0, 1)^2, \quad \ell = 1, \dots, N.$$

- The sets are called **patches**.
- We assume that they are mutually disjoint, i.e., $\pi^\ell \cap \pi^k \neq \emptyset \Rightarrow \ell = k$.

Preliminaries



Patches and associated spline spaces.

The patchwork spline space

Collecting all patches results in the *domain* Ω , i.e.,

$$\Omega = \text{int} \left(\bigcup_{\ell=1}^N \overline{\pi^\ell} \right) \subseteq (0, 1)^2.$$

Now we define the *patchwork spline space* :

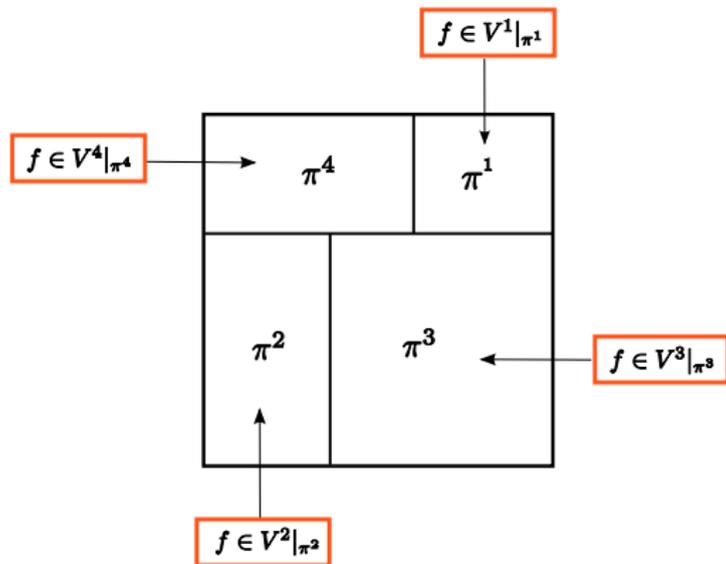
$$\mathcal{P} = \{f \in C^s(\Omega) : f|_{\pi^\ell} \in V^\ell|_{\pi^\ell} \forall \ell = 1, \dots, N\},$$

with maximal order of smoothness

$$\mathbf{s} = \mathbf{p} - 1.$$

The patchwork spline space

Definition: $\mathcal{P} = \{ f \in C^s(\Omega) : f|_{\pi^\ell} \in V^\ell|_{\pi^\ell} \forall \ell = 1, \dots, N \}$



- (1) C^s -smooth functions
- (2) patch restriction belongs to assoc. spline space

PATCHWORK B-SPLINES



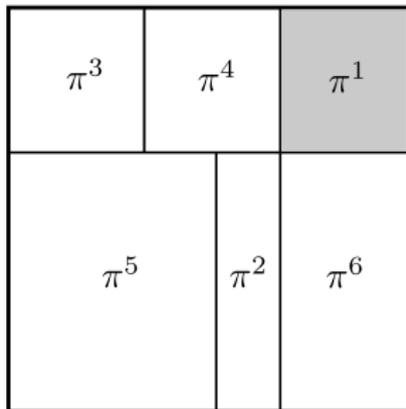
BASIS FUNCTIONS

Constraining boundaries

The *constraining boundary* of a patch

$$\Gamma^\ell = \bigcup_{k=1}^{\ell-1} \overline{\pi^k} \cap \overline{\pi^\ell},$$

is the part of the boundary shared with patches of a lower level.



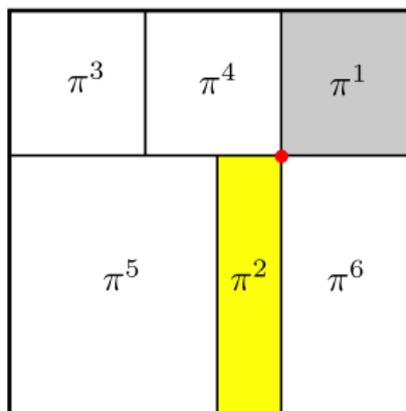
Constraining boundaries of π^1

Constraining boundaries

The *constraining boundary* of a patch

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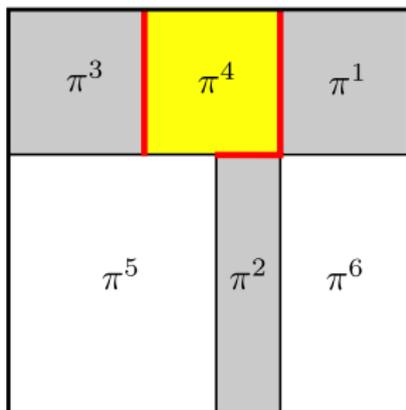
Constraining boundaries of π^2

Constraining boundaries

The *constraining boundary* of a patch

$$\Gamma^\ell = \bigcup_{k=1}^{\ell-1} \overline{\pi^k} \cap \overline{\pi^\ell},$$

is the part of the boundary shared with patches of a lower level.



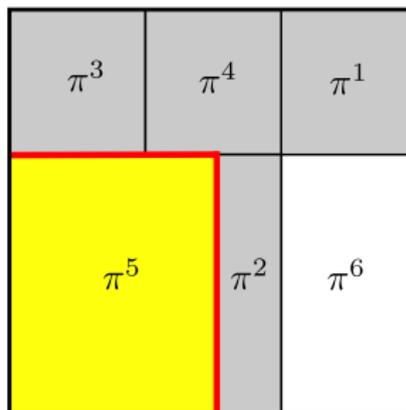
Constraining boundaries of π^4

Constraining boundaries

The *constraining boundary* of a patch

$$\Gamma^\ell = \bigcup_{k=1}^{\ell-1} \overline{\pi^k} \cap \overline{\pi^\ell},$$

is the part of the boundary shared with patches of a lower level.



Constraining boundaries of π^5

Selection mechanism

We generalize Kraft's selection mechanism:

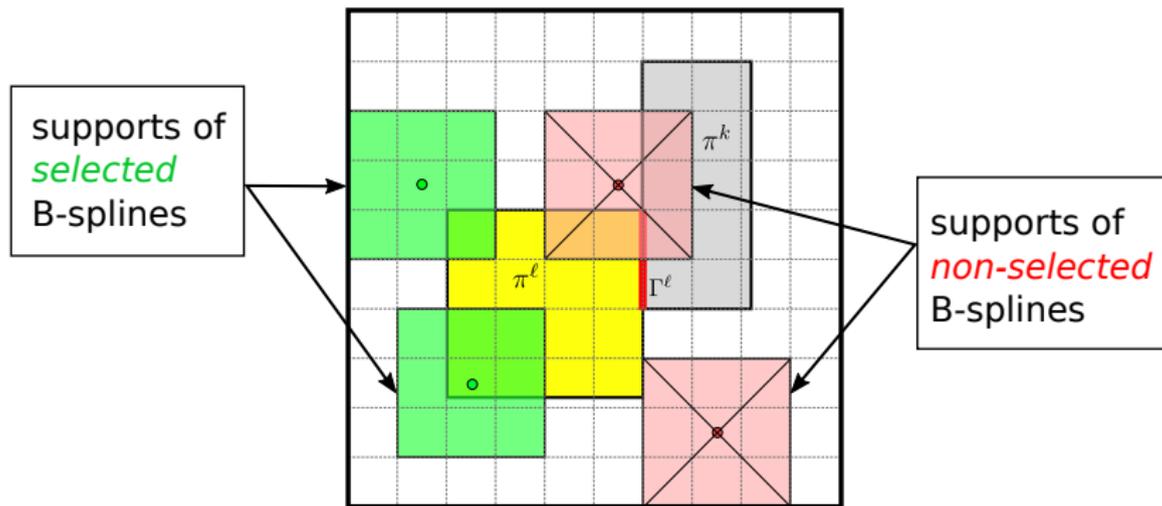
$$K^\ell = \{\beta^\ell \in B^\ell : \beta^\ell|_{\pi^\ell} \neq 0 \text{ and } \beta^\ell|_{\Gamma^\ell} = 0\}.$$

Definition: The *patchwork B-splines* (PB-splines) are obtained by forming the union over all levels,

$$K = \bigcup_{\ell=1}^N K^\ell.$$

Selection mechanism

$$K^\ell = \{\beta^\ell \in B^\ell : \beta^\ell|_{\pi^\ell} \neq 0 \text{ and } \beta^\ell|_{\Gamma^\ell} = 0\}.$$

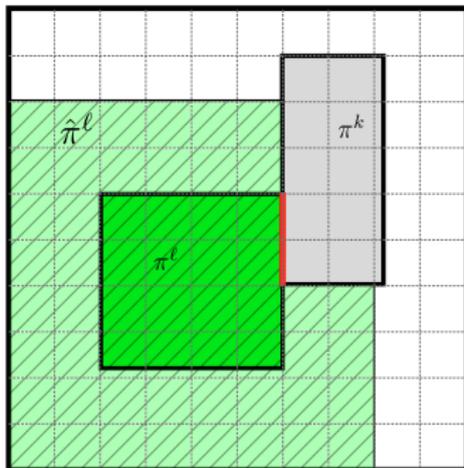


The selection mechanism for PB-splines ($k < \ell$).

Shadow

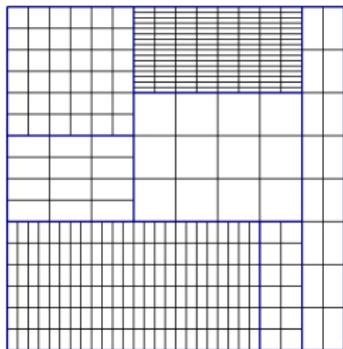
We define the **shadow** of a patch π^ℓ as the union of all supports of the selected basis functions,

$$\hat{\pi}^\ell = \text{supp}K^\ell = \bigcup_{\beta^\ell \in K^\ell} \text{supp}\beta^\ell.$$

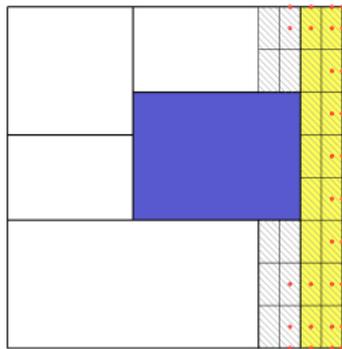


Example: Shadows and meshes

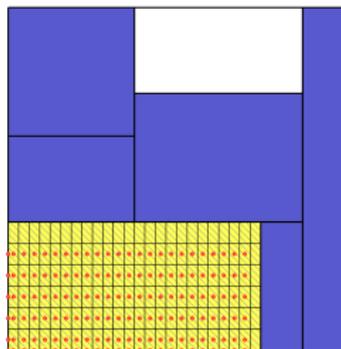
The knot lines of the spline space V^ℓ define a **mesh** M^ℓ of level ℓ .



A patchwork mesh.



Shadow and selected basis functions for two levels.
(points: selected B-splines, shadow: hatched area)



PATCHWORK B-SPLINES

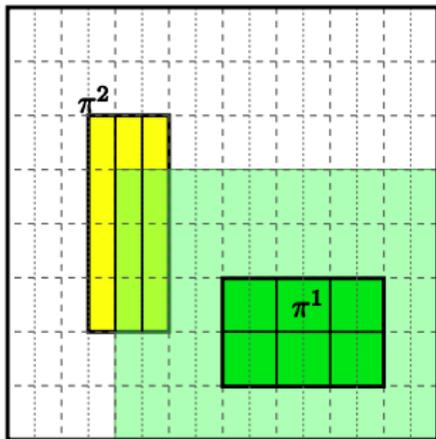


CHARACTERIZING THE SPLINE SPACE

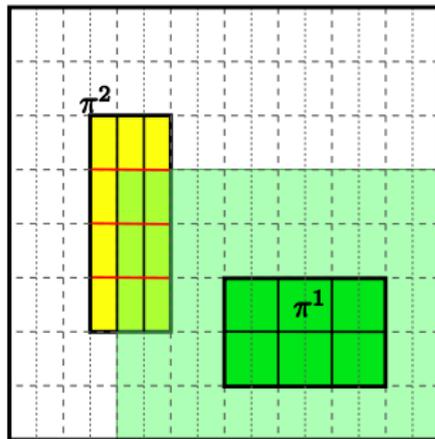
Shadow Compatibility Assumption (SCA)

Assumption If the shadow $\hat{\pi}^\ell$ of the patch of level ℓ intersects another patch π^k of a different level k , then the first level **precedes** the second one,

$$\hat{\pi}^\ell \cap \pi^k \neq \emptyset \Rightarrow \ell \leq k \text{ and } V^\ell \subseteq V^k.$$



SCA not satisfied.

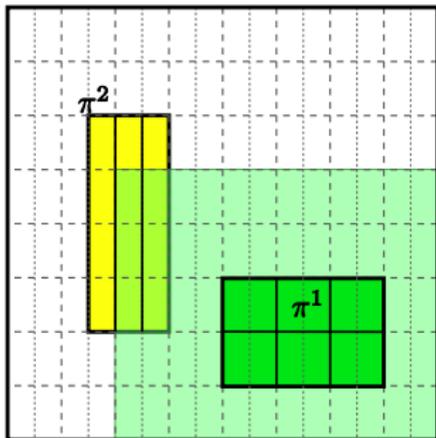


SCA satisfied.

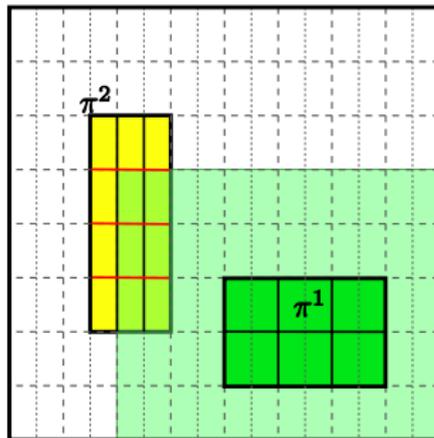
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SCA not satisfied.

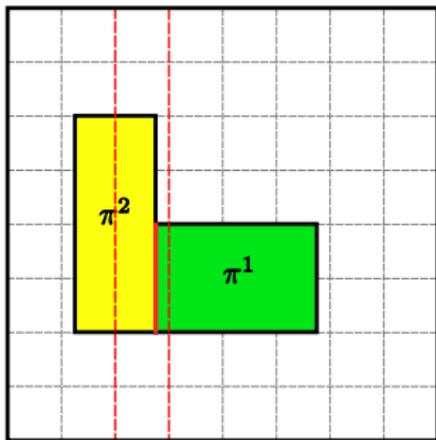


SCA satisfied.

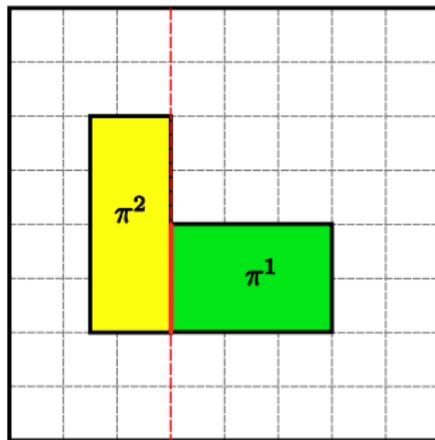
Theorem: SCA implies linear independence of PB-splines.

Constraining Boundary Alignment (CBA)

Assumption For each level ℓ , the constraining boundary Γ^ℓ of the patch π^ℓ is aligned with the knot lines of the spline space V^ℓ .



CBA not satisfied.



CBA satisfied.

Space characterization

Theorem The PB-splines span the patchwork spline space \mathcal{P} if both SCA and CBA are satisfied.

Thus, we have *two different characterizations* of the patchwork spline space:

$$\mathcal{P} = \{f \in C^s(\Omega) : f|_{\pi^\ell} \in V^\ell|_{\pi^\ell} \forall \ell = 1, \dots, N\},$$

(*“implicit”* definition: space defined by properties of functions)

$$\mathcal{P} = \text{span} \bigcup_{\ell=1}^N \{\beta^\ell \in B^\ell : \beta^\ell|_{\pi^\ell} \neq 0 \text{ and } \beta^\ell|_{\Gamma^\ell} = 0\}$$

(*“constructive”* definition: space defined as linear hull of basis functions)

Restoring partition of unity

Truncation mechanism

Recall: Hierarchical B-splines \rightarrow Truncated Hierarchical B-splines

The recipe:

Truncated function: "original function *minus* contribution of selected basis functions from higher levels"

Is there a generalization to truncated PB-splines?

Restoring partition of unity

Truncation mechanism

Recall: Hierarchical B-splines \rightarrow Truncated Hierarchical B-splines

The recipe:

Truncated function: "original function *minus* contribution of selected basis functions from higher levels"

Is there a generalization to truncated PB-splines? Yes!

Truncated PB-splines

- are linearly independent,
- form a **partition of unity**,
- are non-negative and
- span the patchwork spline space.

PATCHWORK B-SPLINES



PB-SPLINES IN SURFACE APPROXIMATION

Surface approximation problem

- Given: data set $(f_i, \mathbf{x}_i), i = 0, \dots, m,$
 - coordinates of data points $f_i \in \mathbb{R}^3,$
 - associated parameters $\mathbf{x}_i \in [0, 1]^2.$
- Choose a setting that generates the PB-splines K :
 - patches π^1, \dots, π^N and
 - spline spaces $V^1, \dots, V^N.$
- Compute the least squares approximation $f = \sum_{\beta \in K} c_\beta \beta,$ which minimizes

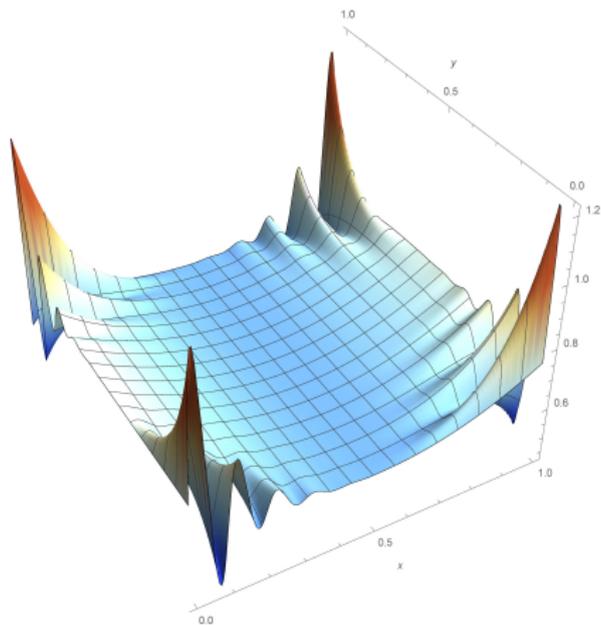
$$\sum_{i=0}^m \|f_i - f(\mathbf{x}_i)\|^2.$$

How to choose the patches and corresponding spline spaces?

- Manual construction
- Automatic refinement process

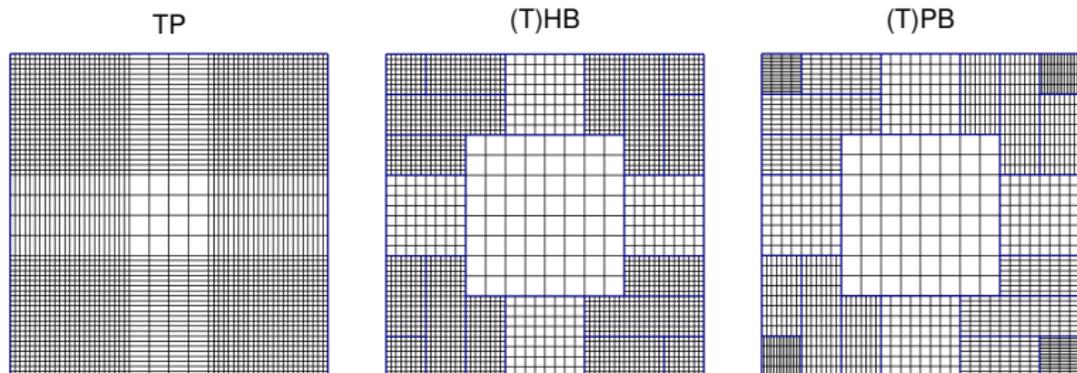
Example I

We want to approximate the following function:



Function for approximation.

Manual mesh generation



The meshes used for defining the approximating spline functions.

	no. of dof	% of dof	max. error	average error
tensor-product B-splines	2916	100%	3.08e-3	1.5e-4
HB-splines	2468	85 %	3.08e-3	1.02e-4
PB-splines	1572	54 %	1.03e-3	6.94e-5

Numerical results of the least-squares approximation.

Automatic mesh refinement

- Initial setting defining K_0
 - patches π^1, \dots, π^{N_0} and
 - spline spaces $V_0^1, \dots, V_0^{N_0}$.
- Compute least squares approximation for K_0
- Marking process:
 - Identify those \mathbf{x}_i with $\|f_i - f(\mathbf{x}_i)\| > \varepsilon$,
 - find the patches that contain \mathbf{x}_i ,
 - mark them for refinement.
- Refinement process:
 - n -adic subdivision of the marked patches,
 - (poss. new marking process),
 - knot refinement in the corresponding spline spaces,
 - ensure that all assumptions are satisfied.
 - **Challenge:** Determine the **direction** of the refinement

Determining the refinement direction

Determining the refinement direction with a *local fitting-based* method:

- Perform local fitting on patches π^ℓ .
- Try different refinement strategies, e.g., uniform knot refinement in x - vs. in y -direction.
- The strategy that performs better, i.e., produces less error, determines the refinement direction.

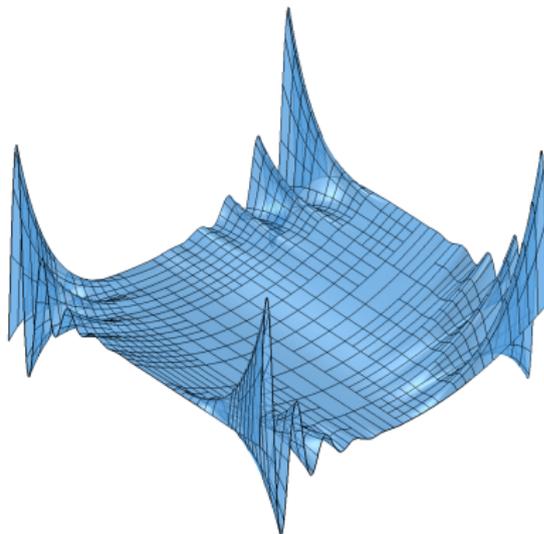
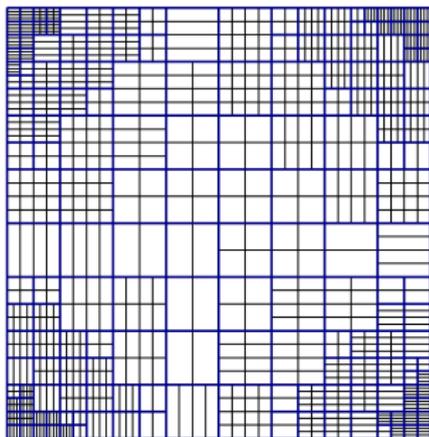
Advantages:

- No assumptions on data,
- simple.

Disadvantages:

- Could become slow if too many strategies are tested.

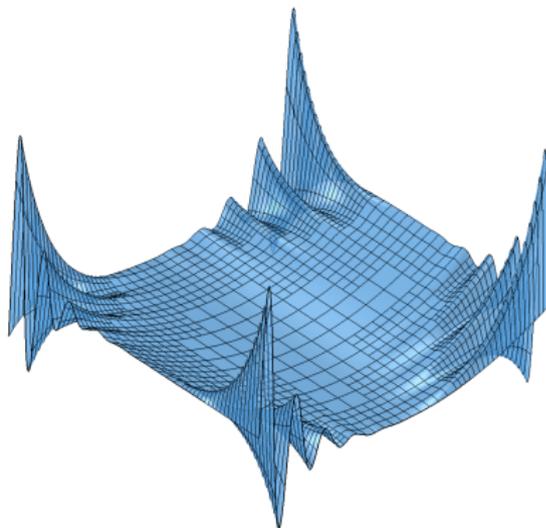
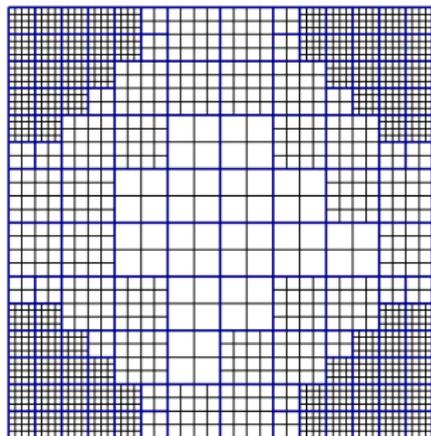
Automatic mesh refinement - results



PB-spline mesh after 4 steps of adaptive refinement and resulting surface.

	no. of dof	% of dof	max. error	average error
HB-splines	1860	100 %	3.08e-3	1.42e-4
PB-splines	1106	59 %	1.12e-3	1.31e-4

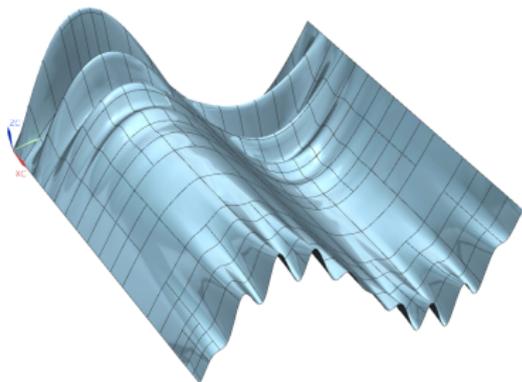
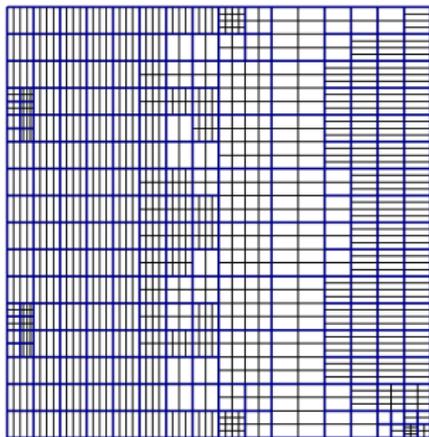
Automatic mesh refinement - results



HB-spline mesh after 3 steps of adaptive refinement and resulting surface.

	no. of dof	% of dof	max. error	average error
HB-splines	1860	100 %	3.08e-3	1.42e-4
PB-splines	1106	59 %	1.12e-3	1.31e-4

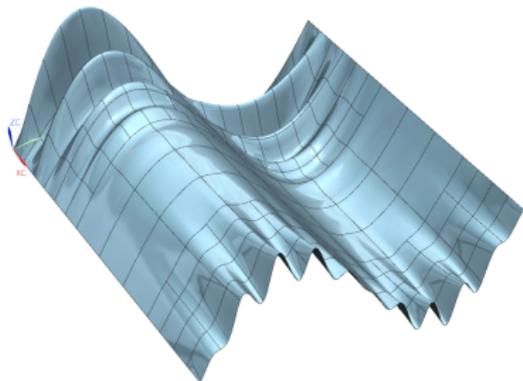
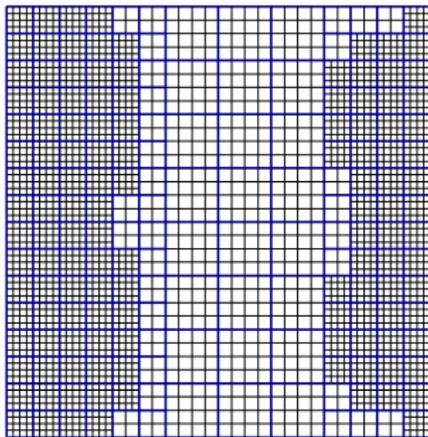
Example II



PB-spline mesh after 4 steps of adaptive refinement and resulting surface.

	no. of dof	% of dof	max. error	average error
HB-splines	2688	100 %	1.01e-3	1.56e-4
PB-splines	1169	43 %	1.06e-3	1.47e-4

Example II



HB-spline mesh after 3 steps of adaptive refinement and resulting surface.

	no. of dof	% of dof	max. error	average error
HB-splines	2688	100 %	1.01e-3	1.56e-4
PB-splines	1169	43 %	1.06e-3	1.47e-4

PATCHWORK B-SPLINES



SUMMARY AND OUTLOOK

Summary

- Generalization of the Kraft selection mechanism from hierarchical B-splines to PB-splines
- Characterization of the spline space spanned by the PB-splines
- Introduction of a truncation mechanism → partition of unity
- Application of PB-splines to surface approximation
- Automatic refinement algorithm for PB-spline meshes
- PB-splines enable the use of independent refinement strategies
- PB-splines need fewer degrees of freedom than HB-splines

Current work and outlook

- Generalizing the completeness result from HB-splines to PB-splines
- Generalizing the approximation error estimates from HB-splines to PB-splines
- Implementation of the truncation mechanism
- Development of further automatic mesh refinement strategies
- Application in industry
 - Fitting of structural components like airfoils → periodic fitting
 - Lofting