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# Estimation of Computational Error by Higher Order Approximation in the Multipoint Meshless FDM

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# Introduction

- Error analysis – **essential** part of b.v. problems solution
- On Multipoint meshless FDM
  - solution **approach**
- Bases of meshless finite difference method (MFDM) **error analysis**
- Application of Multipoint method to **reference solution** generation
- **Numerical** analysis of **benchmark** problems
- Final remarks

## **Objective of this research**

Investigation of the **Multipoint** MFDM application to  
a posteriori **error analysis** by means of generation  
of **high** quality HO **reference** solutions

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# Raising order of local MFDM approximation

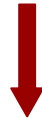
## ON ERROR ANALYSIS

- Solutions

- true  $u^T$
- rough (low order, coarse mesh)  $u^L$
- higher quality (higher order, fine mesh)  $u^H$

- Generation of reference solution  $u^H$

- mesh density increase ( $h$ )
- raising approximation order ( $p$ )
- mixture of both ( $hp$ )



- Raising order of local MFDM approximation

- Defect (deferred) correction – use of MFD stars with increased number of nodes
- Use of (additional) generalised d.o.f.
- **Multipoint approach**
- Use of higher order (HO) correction terms
- $p$ - and  $p/h$ - adaptive approach

# Idea of Multipoint approach

- Given PDE (ODE)

$$\mathcal{L}u = f,$$

$$u = u(P)$$

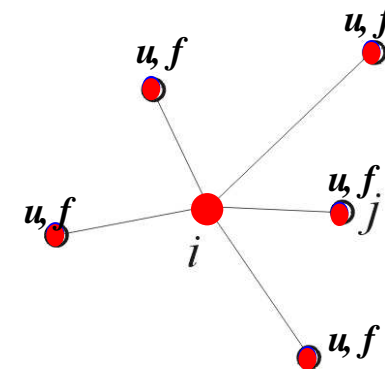
- FD discretization

– Standard

$$\mathcal{L}u_i \approx Lu_i = \sum_{j(i)} C_j u_j = f_i \quad \Rightarrow \quad \boxed{Lu_i = f_i} \quad u_j = u(P_j)$$

– Multipoint

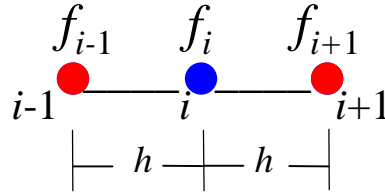
$$\mathcal{L}u_i \approx \sum_{j(i)} C_j u_j = \sum_{j(i)} \alpha_j f_j \quad \Rightarrow \quad \boxed{Lu_i = Mf_i}$$



$\mathcal{L}$  – differential operator. In general it may be referred to: differential eqs, boundary conditions, integrand in global formulation of the considered b.v. problem

$f_i$  – value of the whole operator  $\mathcal{L}u_i$  or its part only, e.g. a specific derivative  $u^{(k)}$

# Multipoint – simple examples



**Classic FD**

$$Au_{i-1} + Bu_i + Cu_{i+1} = f_i$$

**Multipoint approach**

$$Au_{i-1} + Bu_i + Cu_{i+1} = \alpha f_{i-1} + \beta f_i + \gamma f_{i+1}$$

1st derivative

$$u'_i \approx \frac{u_{i+1} - u_{i-1}}{2h} + O(h^2)$$

$$\frac{u_{i+1} - u_{i-1}}{2h} \approx \frac{(u'_{i-1} + 4u'_i + u'_{i+1}))}{6} + O(h^4)$$

2nd derivative

$$u''_i \approx \frac{u_{i+1} - 2u_i + u_{i-1}}{h^2} + O(h^2)$$

$$\frac{u_{i+1} - 2u_i + u_{i-1}}{h^2} \approx \frac{(u''_{i-1} + 10u''_i + u''_{i+1}))}{12} + O(h^4)$$

**Higher order approximation without raising the number of nodes!**

# Generalization of the classic Multipoint FDM

## Collatz

## Meshless

- **Mesh**

*regular*

*no mesh, irregular* or *regular*  
cloud of nodes

- **Formulation**

*local*

*local, global, mixed*

- **Approximation**

*interpolation*

*MWLS approximation*

## Method variants

*specific*

$$\sum_{j(i)} C_j u_j = \sum_{j(i)} \alpha_j f_j$$

*general (variants)*

$$\sum_{j(i)} C_j u_j = \sum_{j(i)} \alpha_j u_j^{(k)}$$

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# Multipoint Meshless FDM approach

**new Multipoint Meshless FDM =**

= Meshless FDM + Formulations +

+ MWLS approximation +

+ Collatz multipoint approach



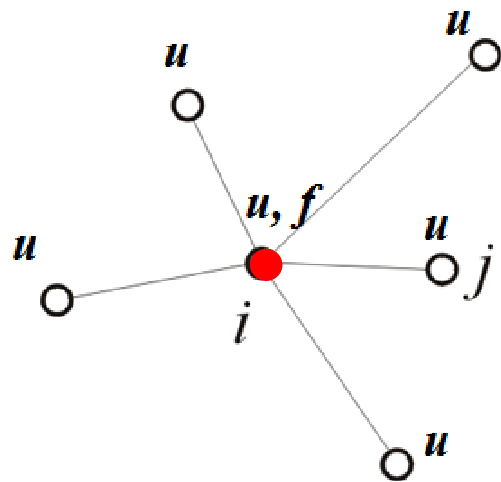
provides higher order approximation used for

- Solution of b.v. problems
- **A posteriori error analysis**



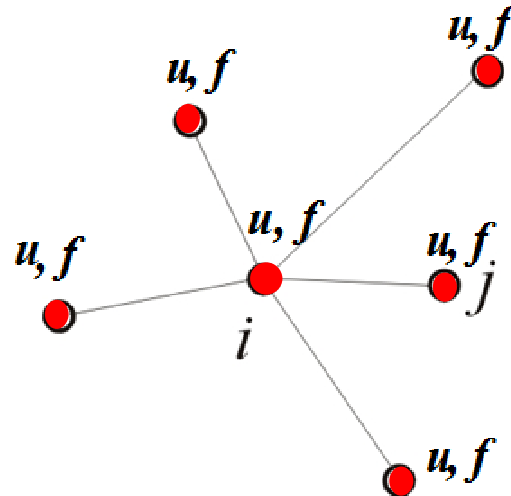
# Basic Multipoint formulations

## MFD star and d.o.f.



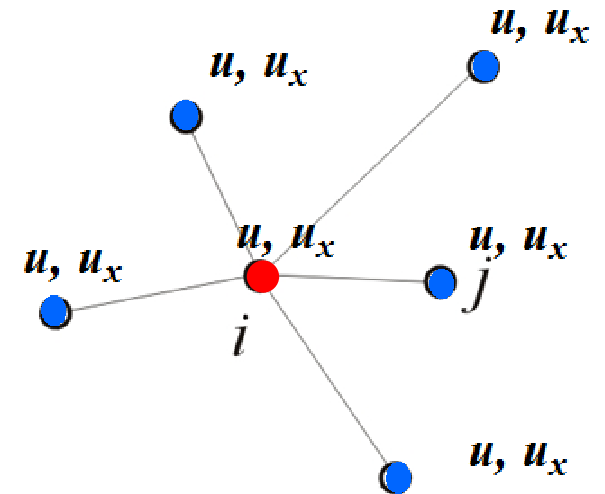
$$\sum_{j(i)} C_j u_j = f_i$$

a) Standard meshless FDM



$$\sum_{j(i)} C_j u_j = \sum_{j(i)} \alpha_j f_j$$

b) Specific multipoint

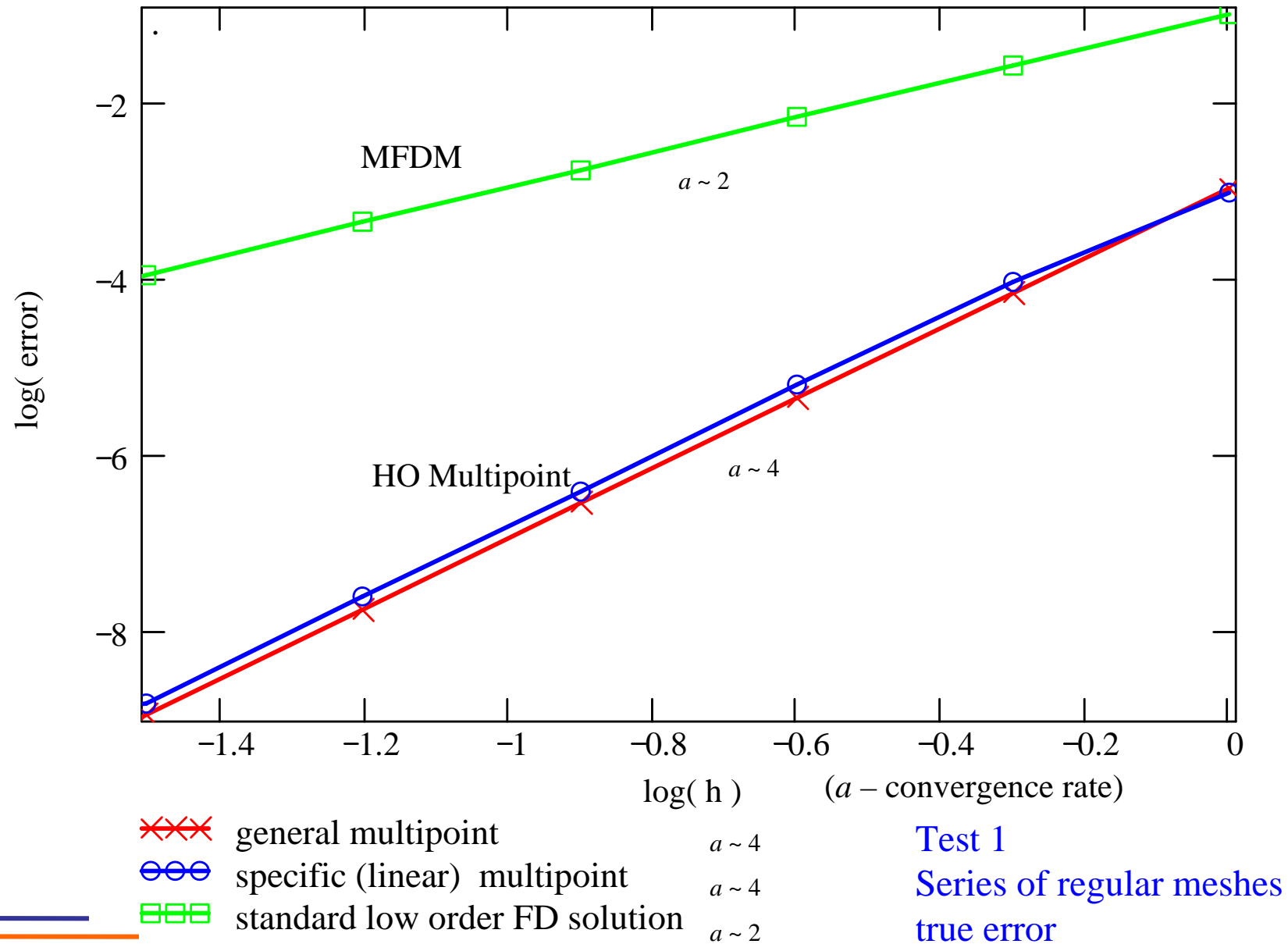


$$\sum_{j(i)} C_j u_j = \sum_{j(i)} \alpha_j u_j^{(k)}$$

c) General multipoint



# Comparison of solution convergence



# Error analysis – bases

- **Solution types**

- $u^T$  – true solution (unknown)
- $u^L$  – rough solution (known)
- $u^H$  – higher order improved solution usually assumed as the reference one

## Error

- **Types**

- a priori, a posteriori (to examine solution quality, to generate adaptive mesh)
- solution error, residual error
- local, global

- **Norms**

- maximum, mean square, energy

- **Definitions**

- true low order error  $e^{TL} = \|u^T - u^L\|$
- true higher order error  $e^{TH} = \|u^T - u^H\|$
- estimated error  $e^{HL} = \|u^H - u^L\| \approx e^{TL}$

- **Problem:** how to generate a reference solution  $u^H$ ? **Multipoint MFDM**

# A posteriori error MFDM analysis – local error estimation

**True solution**

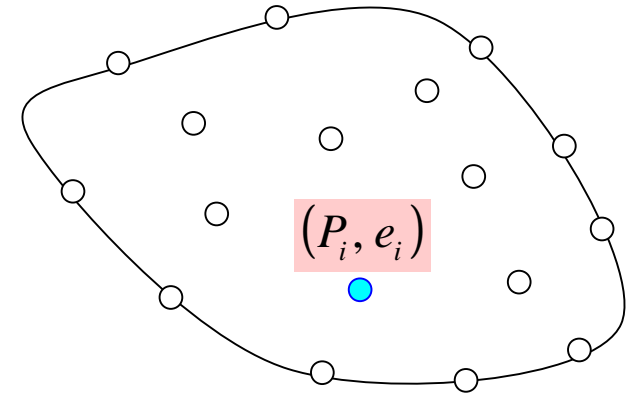
$$\mathcal{L}u = f, \quad \longrightarrow \quad u^T$$

**Lower order solution (standard MFDM)**

$$\mathcal{L}u \approx Lu = f, \quad Lu = f \quad \longrightarrow \quad u^L$$

**Higher order solution (Multipoint MFDM)**

$$\mathcal{L}u \approx Lu = Mf, \quad Lu = Mf \quad \longrightarrow \quad u^H$$



**Local solution error**

$$e^{TL} = u^T - u^L \quad \longrightarrow \quad \boxed{e^{HL} = u^H - u^L \approx e^{TL}}$$

$$e^{TH} = u^T - u^H$$

**Higher order (Multipoint) estimation**  
of the local solution error

$$\boxed{e^{HH} = u^{H(p1)} - u^{H(p2)} \approx e^{TH}} \quad \text{various use of HO approximations}$$

**Local residual error**

$$r = \mathcal{L}u - f \quad \longrightarrow \quad r^L = Lu^L - f$$

$$\boxed{r^H = Lu^H - f}$$

**Standard – low order estimation**  
of the local residuum

**Improved – higher order estimation**  
of the local residuum

# A posteriori error MFDM analysis – global error estimation

Global solution error  $\eta = \|e\|$

- Error norms  $\|\cdot\|$  used:

$$\|e\|_E = \sqrt{\frac{1}{\Omega} \int_{\Omega} b(e, e) d\Omega}$$

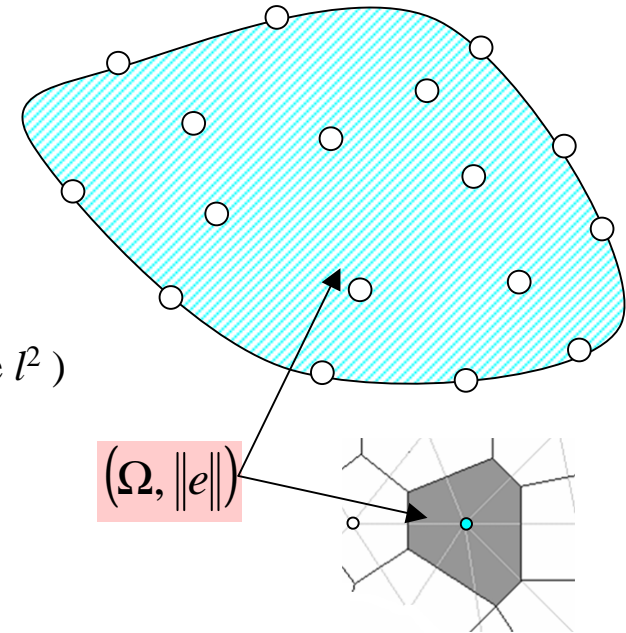
energy norm

$$\|e\|_2 = \sqrt{\frac{1}{N} \sum_{i=1}^N (e_i)^2}$$

mean square norm (discrete  $l^2$ )

Effectivity index of estimator

$$I_{eff} = 1 + \left| \frac{\eta - \|e^{TL}\|}{\|e^{TL}\|} \right|$$



## Hierarchical estimators

**H-type**  $e = u_h^L - u_{h/2}^L$

**P-type**  $e = u_p^L - u_{p+1}^L$

**MHO-type**  $e = u_p^L - u_{p+s}^H$

## Smoothing estimators

**ZZ-type**  $e = u'_{rough}{}^L - u'_{smooth}{}^L$

**MHO-type**  $e = u'_p{}^L - u'_{p+s}{}^H$

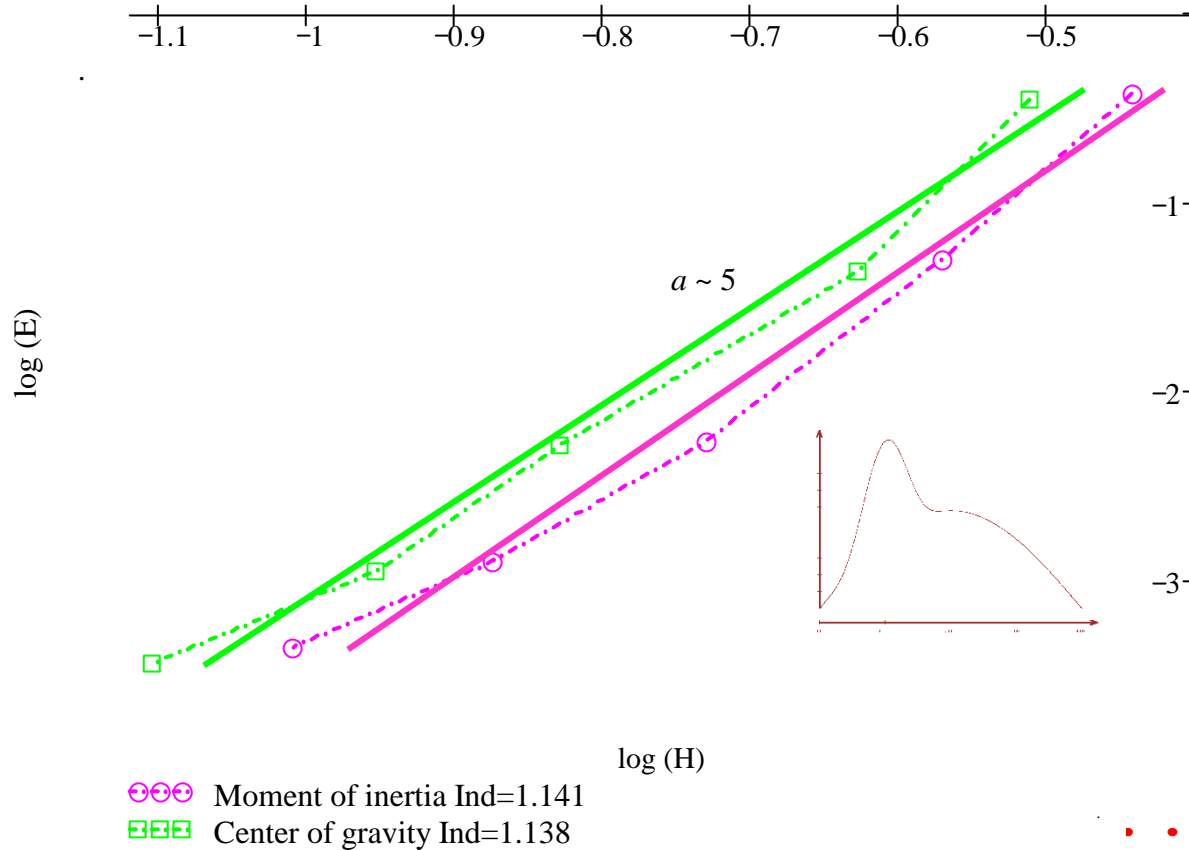
## Residual estimators

**Explicit**  $e = \sqrt{h^2 \|r\|^2 + h/2 \|J\|^2}$

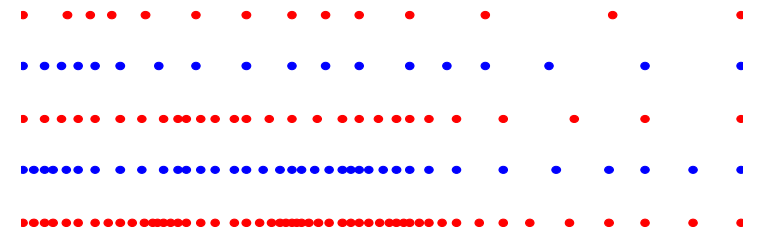
**Implicit**  $e \rightarrow b(e, e) = r$

# Error analysis

- Error indicators for irregular meshes**



Series of **adaptive** meshes



Test 2. Solution **convergence** based on the series of **adaptive** meshes using the both types of the error **indicators**

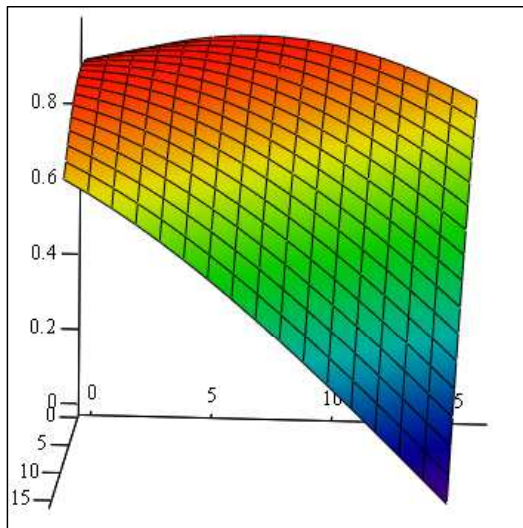
# Benchmark 2D problems

Two-dimensional Poisson's b.v. problem

$$\nabla^2 u = f(x, y) \quad \text{w} \quad \Omega$$

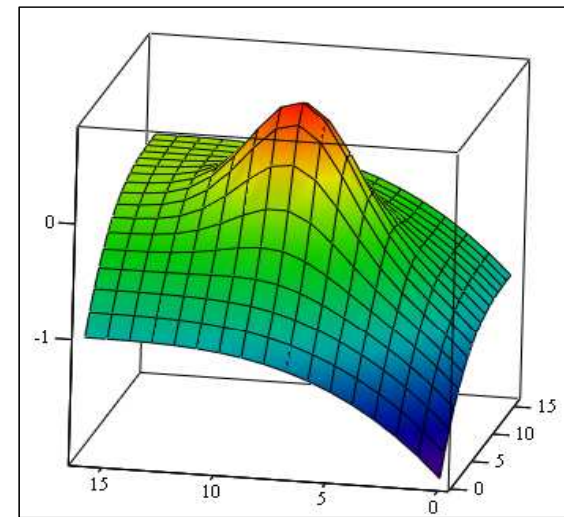
with the Dirichlet b.c.  $0 \leq x \leq 1, \quad 0 \leq y \leq 1$

**Test 3**



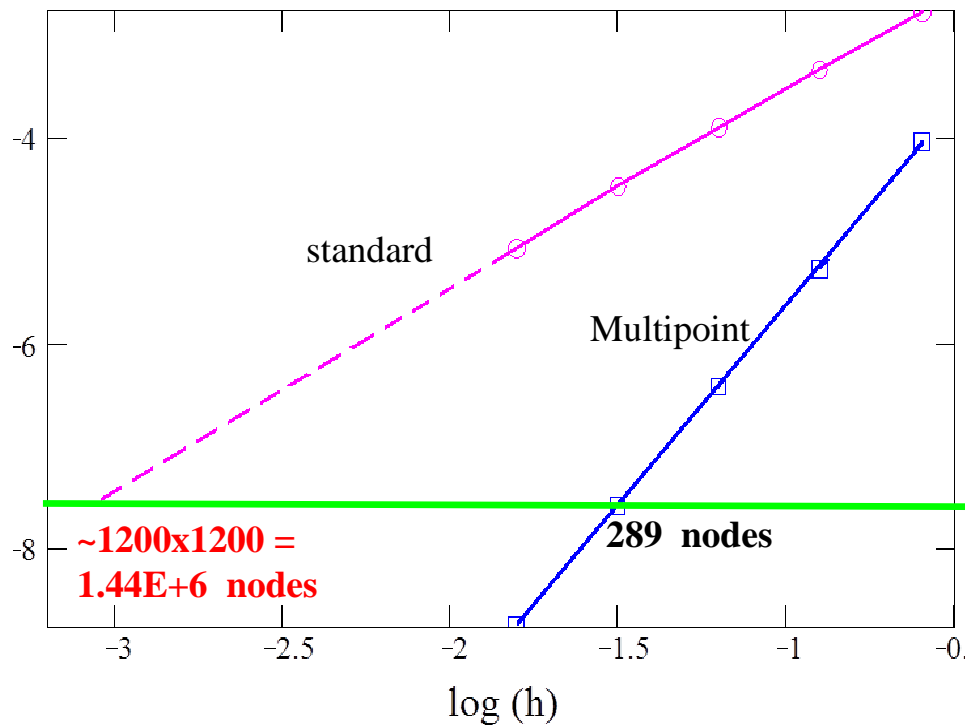
$$u(x, y) = \sin(x + y)$$

**Test 4**



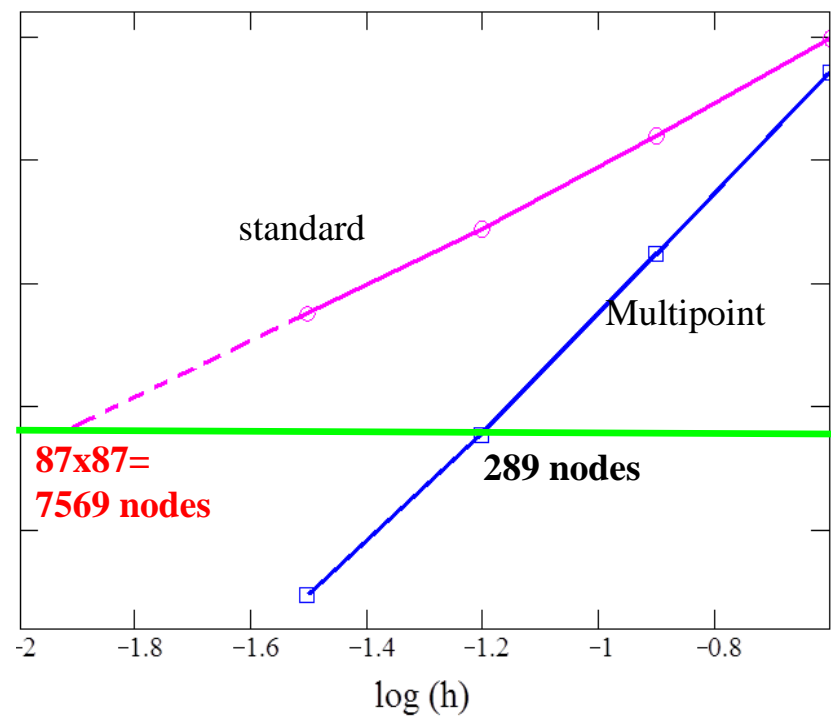
$$u(x, y) = -x^3 - y^3 + \exp\left(-100(x - 0.5)^2 - 100(y - 0.5)^2\right)$$

# Convergence for multipoint & standard MFDM



- 2 order approximation,  $a = 1.9$
- 3 order approximation,  $a = 3.9$

Test 3



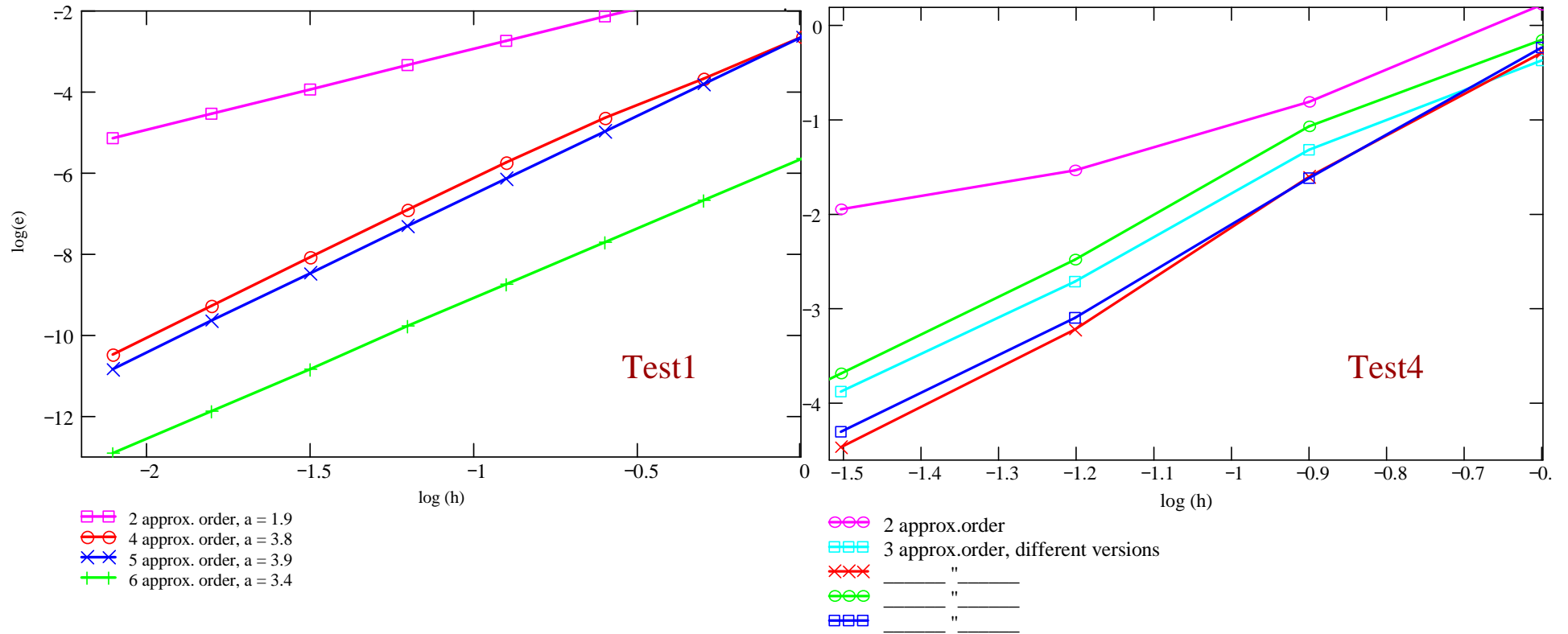
- 2 order approximation
- 3 order approximation

Test 4

Solution convergence, results of the **general multipoint** method and the **standard MFDM**

# Multipoint error analysis

- Hierarchic ( $p$ -type)

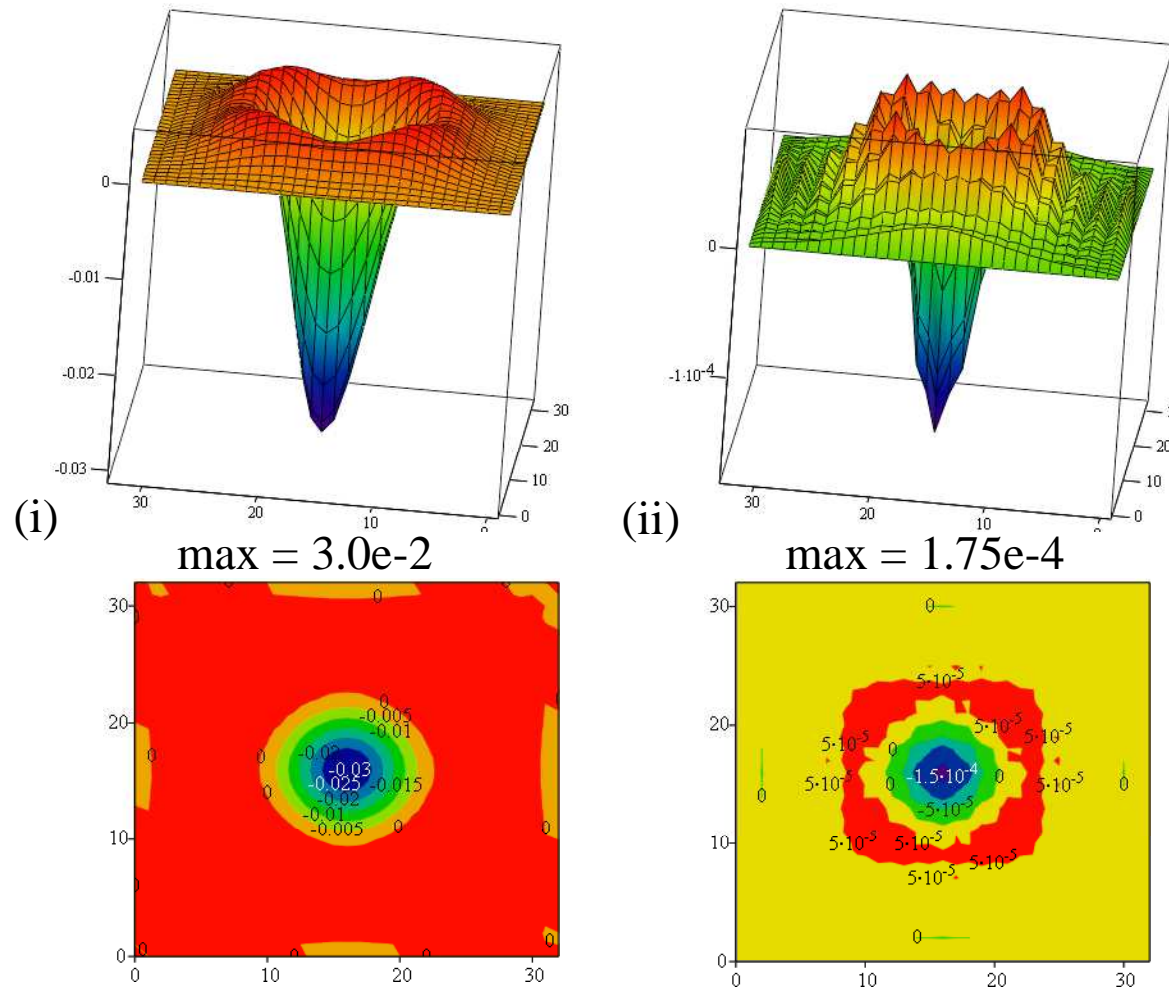


Solution **convergence** based on of the exact mean solution errors for 1D and 2D tests and various approximation orders



# Multipoint error analysis

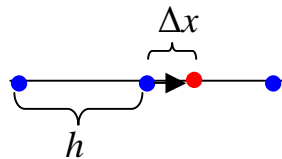
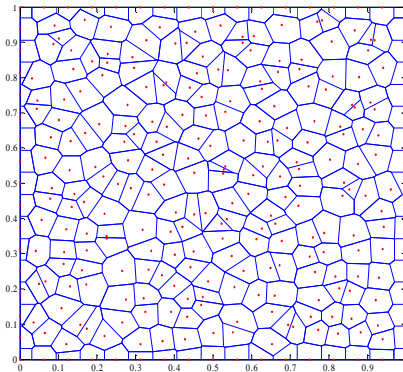
- Hierarchic ( $p$ -type)



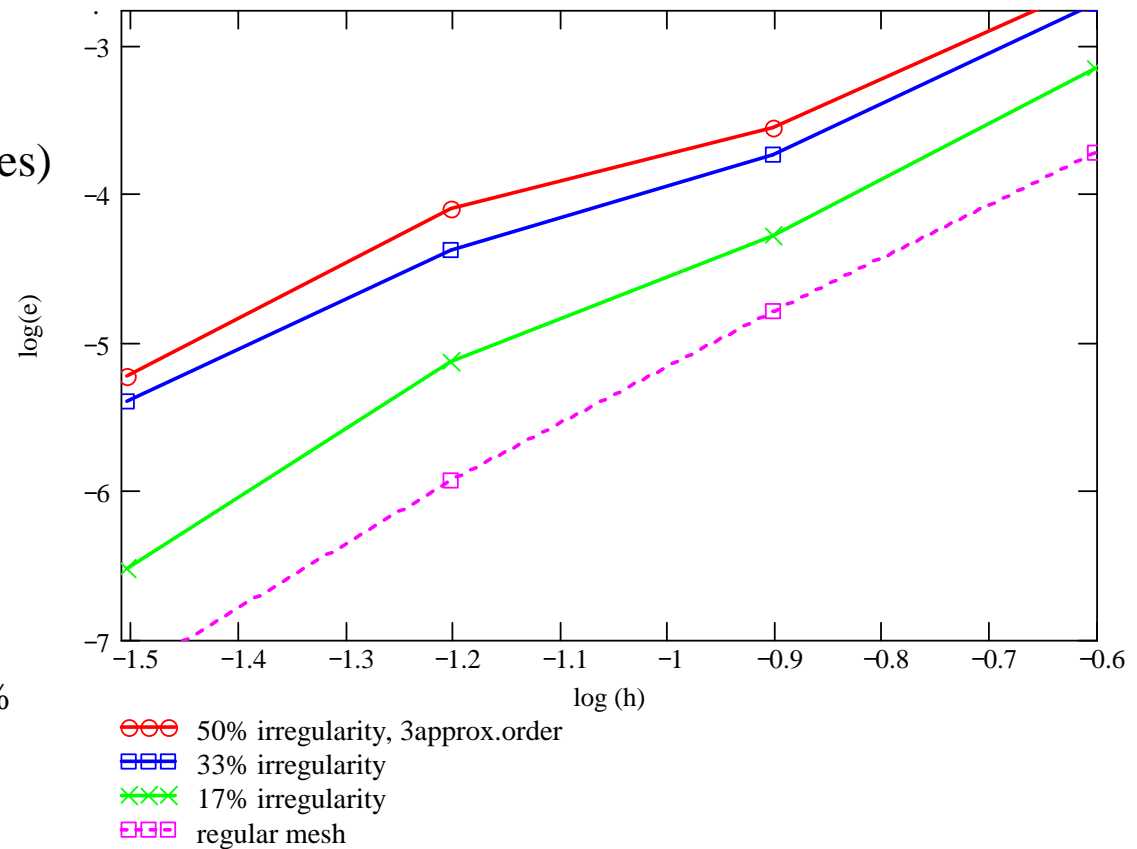
Test 4. The exact solution error of (i) basic MFDM; (ii) Multipoint MFDM

# Multipoint error analysis – irregular meshes

Voronoi polygons for random irregular mesh (up to 33% irregularity 289 nodes)



$$\frac{\Delta x}{h} \leq \frac{1}{3} = 33\%$$

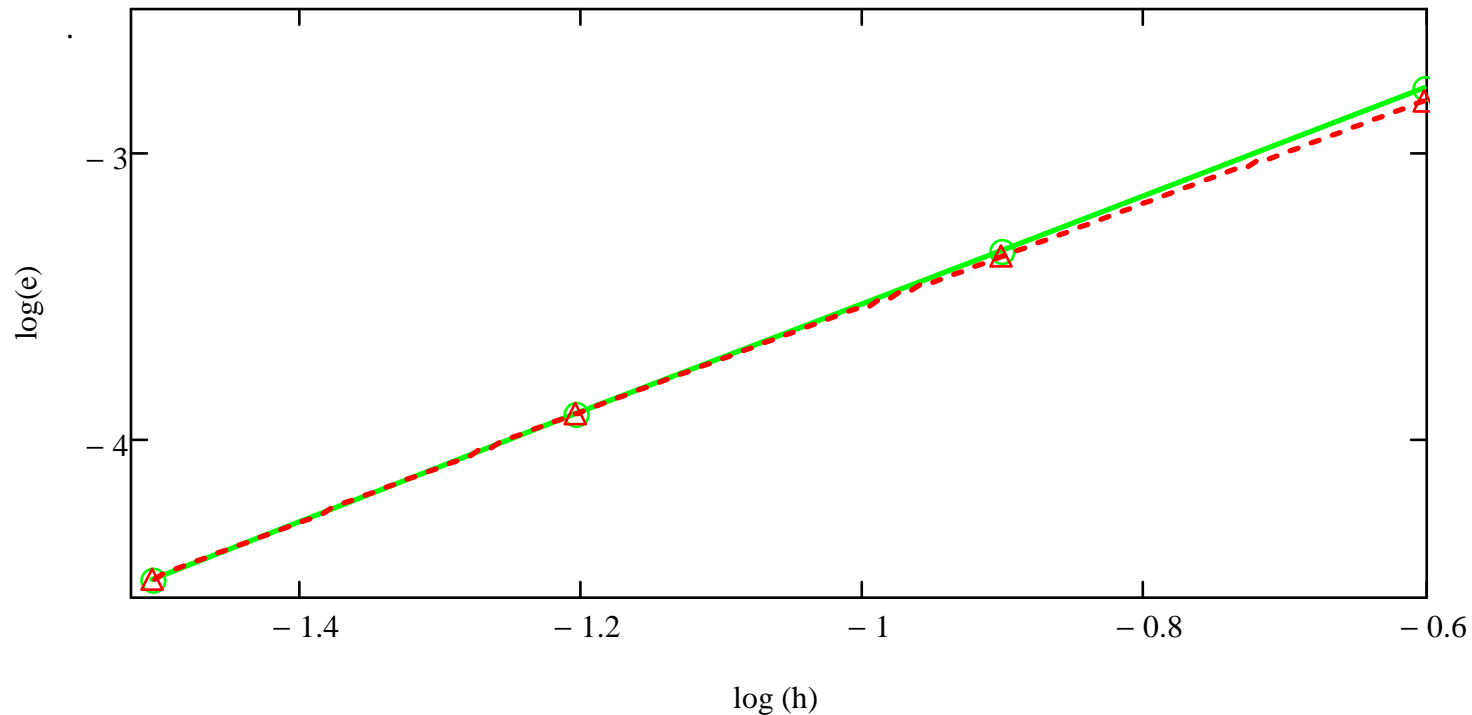


Test 3. **Convergence** of the average of 20 **random irregular** meshes and **regular** ones, all using 3rd approximation order

# Multipoint error analysis

- **Hierarchic estimator**

$$I_{eff} = 1 + \frac{\left| \|e^{HL}\| - \|e^{TL}\| \right|}{\|e^{TL}\|}$$



○ true error - 2 approx. order  
△ error estimation

Comparison of the error **estimation**  $e^{HL}$  and the **exact** error  $e^{TL}$  for low order solution. Test 3, general Multipoint approach. Effectivity index  $\sim 1.1$

# Multipoint error analysis

- Effectivity index

$$I_{eff} = 1 + \frac{\left| \|e^{HL}\| - \|e^{TL}\| \right|}{\|e^{TL}\|}$$

True solution error	Test 3		Test 4	
	Max norm	Euclidean norm	Max norm	Euclidean norm
Higher order true error $e^{TH}$ (version 2)	3.0e-6	1.18e-6	5.12e-3	1.94e-3
Higher order true error $e^{TH}$ (version 3), local formulation	1.22e-6	4.12e-7	1.48e-3	5.93e-4
Higher order true error $e^{TH}$ (version 3), global formulation	1.8e-6	8.29e-7	8.05e-3	3.11e-3
Higher order true error $e^{TH}$ (version 4)	4.0e-6	2.08e-6	6.33e-3	3.5e-3
Lower order true error $e^{TL}$	2.54e-4	1.24e-4	1.35e-1	2.18e-2
Error estimation $e^{HL}$	2.5e-4 – 2.54e-4	1.22e-4 – 1.24e-4	1.27e-1 – 1.34e-1	1.83e-2 – 2.12e-2
Effectivity index $I_{eff}$	1 – 1.02	1 – 1.02	1.01 – 1.06	1.03 – 1.16

Error estimation for various Multipoint MFDM versions. Regular 249 nodes mesh

# Multipoint error analysis – prismatic bar twisting

$\Phi$  – Prandtl stress function,  $G\theta = 1$  – torsional stiffness,  $\Omega$  – domain of the bar cross-section.

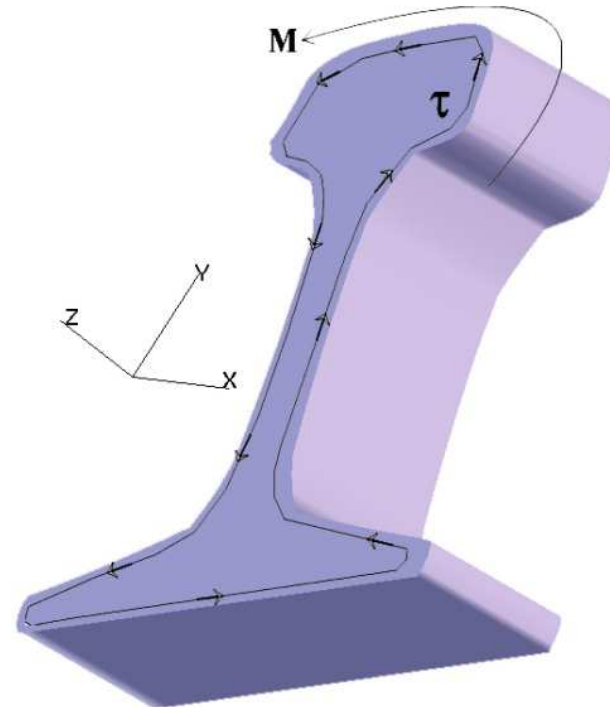
$$\begin{cases} \nabla^2 \Phi = -2G\theta, & \text{in } \Omega \\ \Phi = 0, & \text{on } \partial\Omega \end{cases}$$

The total shear stress

$$\tau = |\text{grad } \Phi| = \sqrt{\tau_{zx}^2 + \tau_{zy}^2}$$

shear stresses are

$$\tau_{zx} = \frac{\partial \Phi}{\partial y}, \quad \tau_{zy} = -\frac{\partial \Phi}{\partial x}$$

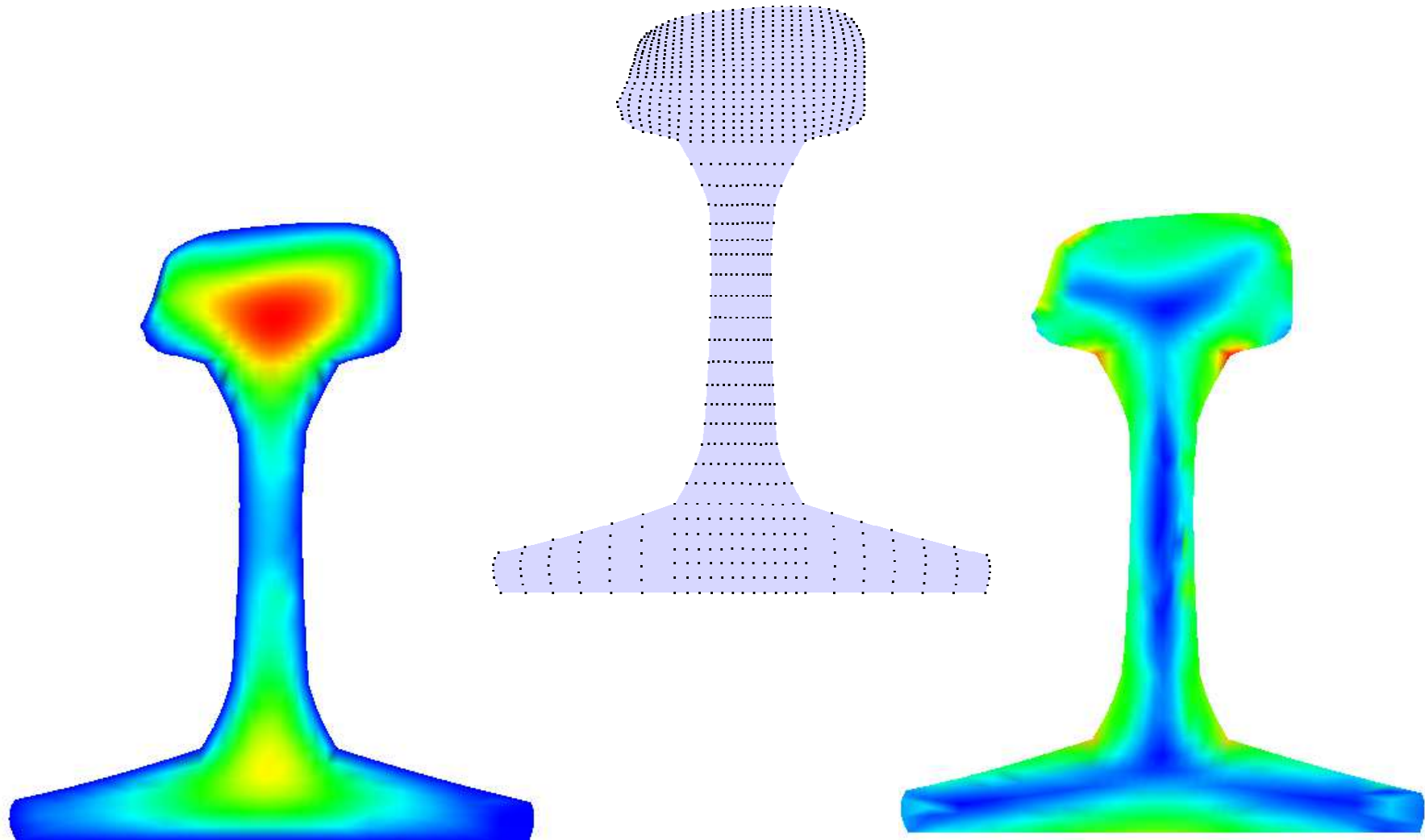


- **Railroad rail cross-section**
- **Benchmark test – square cross-section**

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# Prismatic bar (rail-shape) twisting

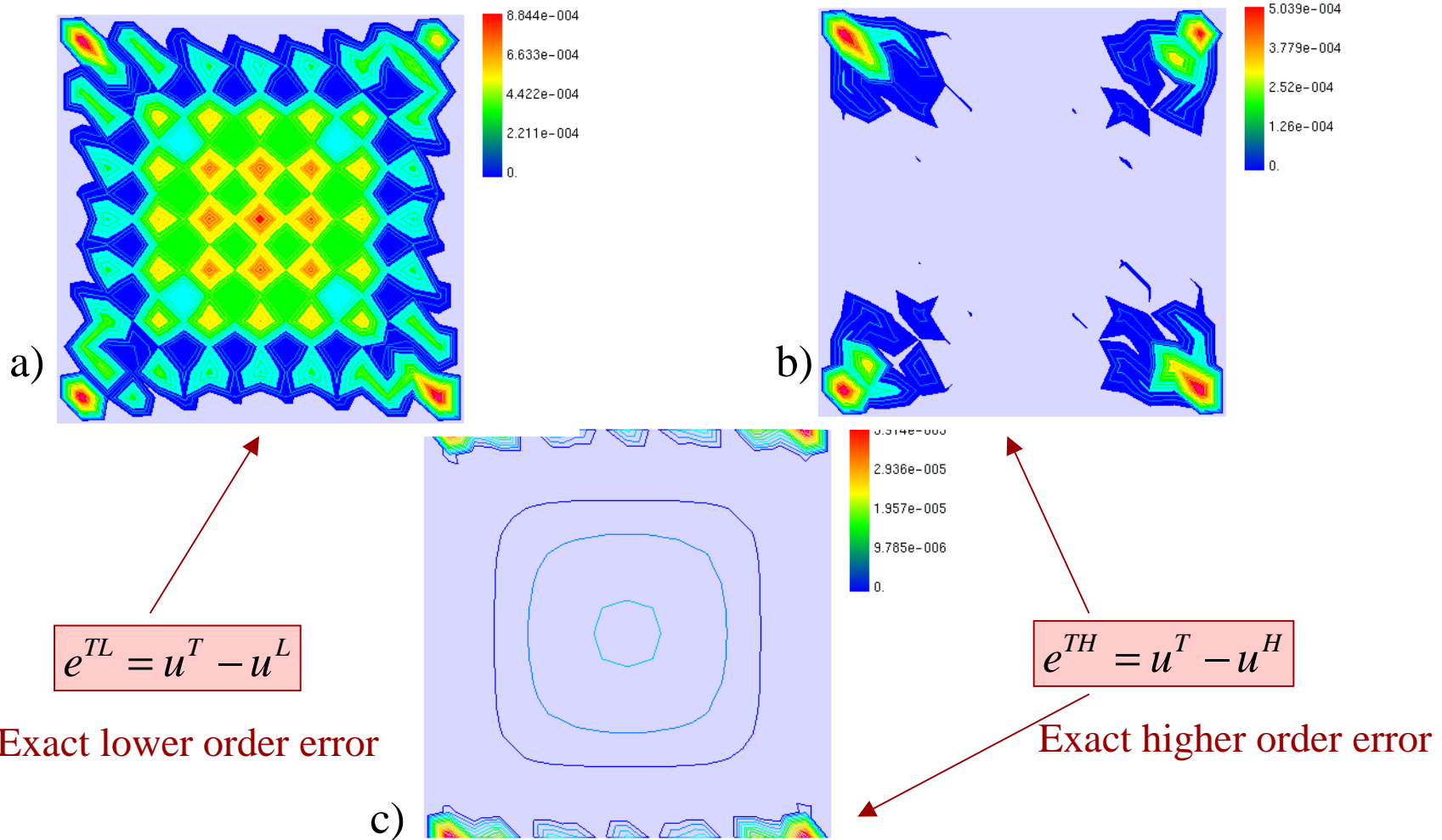


Irregular mesh, Prandtl stress function and total shear stress  
in railroad rail shape bar

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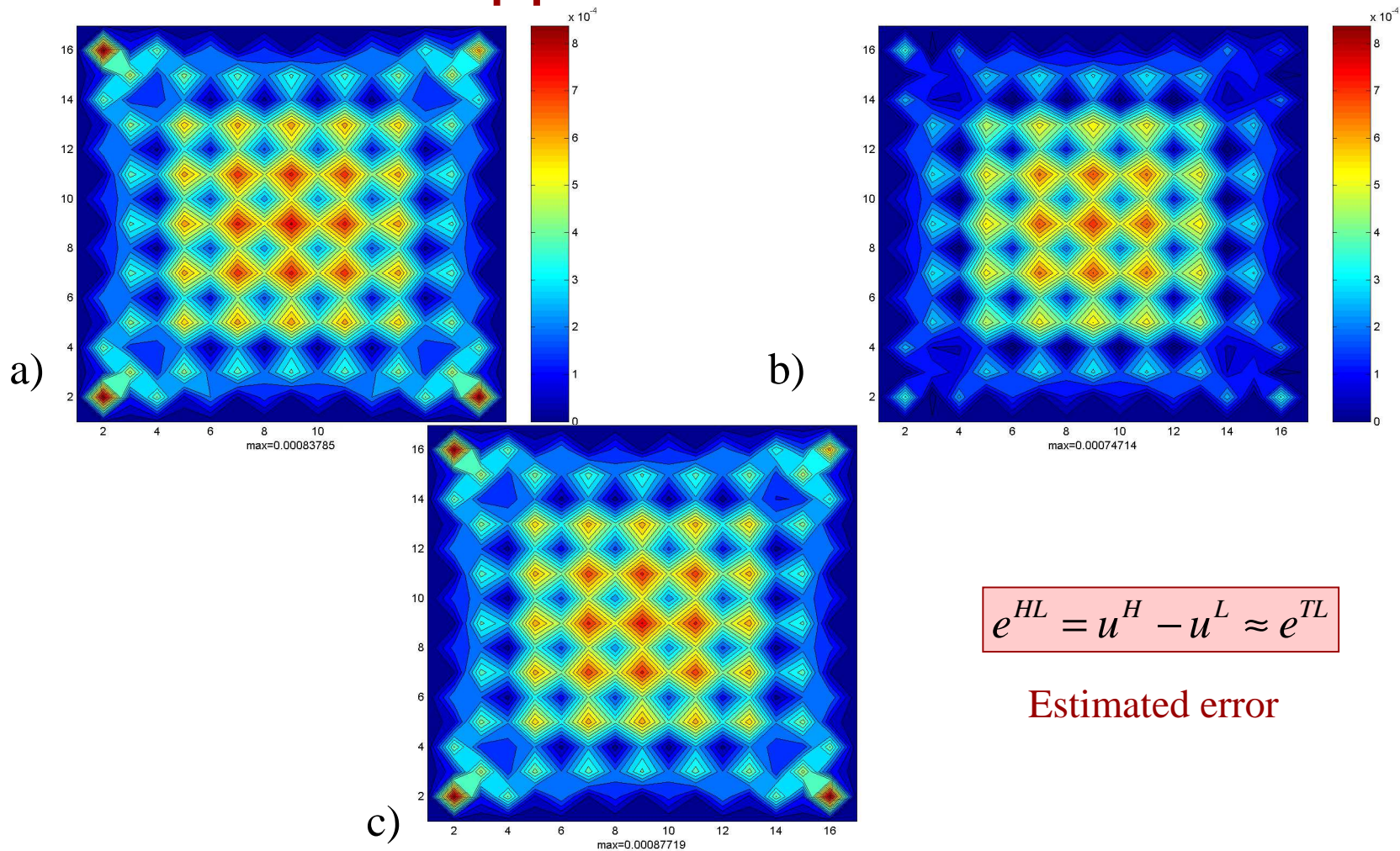
# Prismatic bar twisting. True solution error for Prandtl function



**Multipoint solution error:**

- a) local formulation and 2<sup>nd</sup> app.order,      b) local formulation and 3<sup>rd</sup> app.order,  
c) global-local formulation (MLPG5) and 3<sup>rd</sup> app.order

# Estimated 2<sup>nd</sup> approx. order solution error



$$e^{HL} = u^H - u^L \approx e^{TL}$$

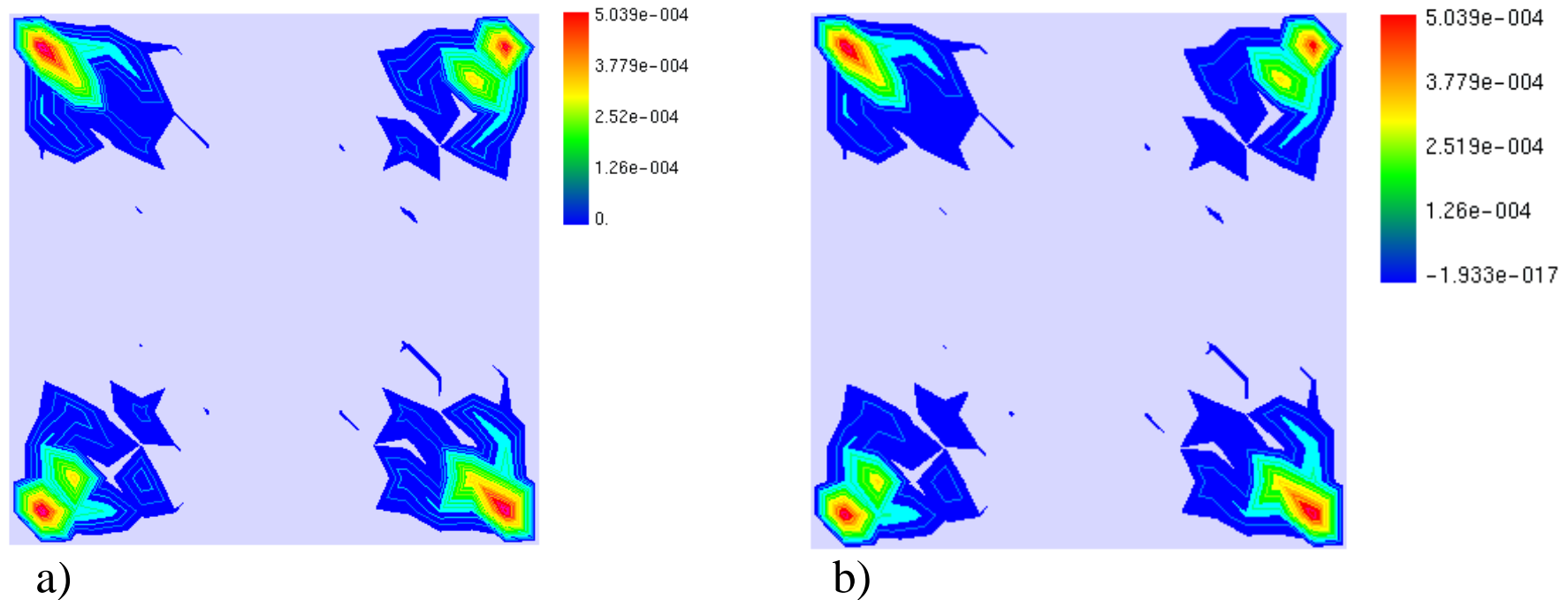
Estimated error

**Multipoint solution (local formulation) error:**

- a) **exact** error of the 2<sup>nd</sup> app.order      b) **estimated** error by 3<sup>rd</sup> app.order  
c) **estimated** error by the **MLPG5** 3<sup>rd</sup> app.order



# Estimated 3<sup>rd</sup> approx. order solution error



$$e^{HH} = u^{H(p1)} - u^{H(p2)} \approx e^{TH}$$

Estimated error

**Multipoint solution error:**

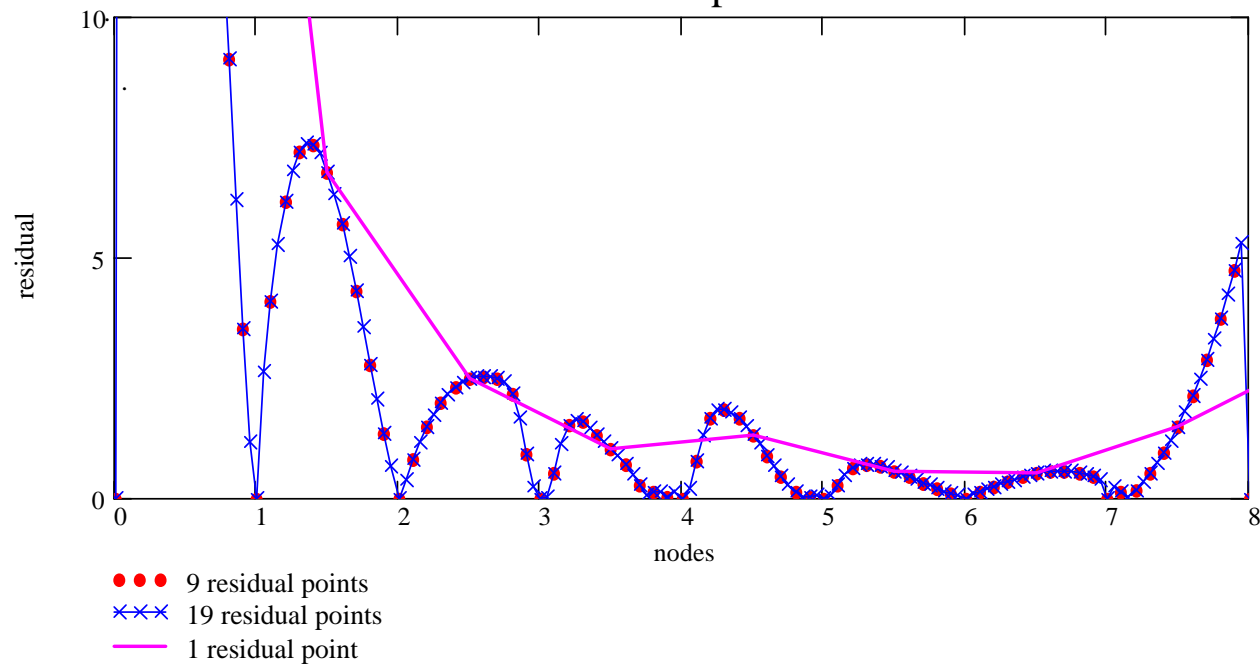
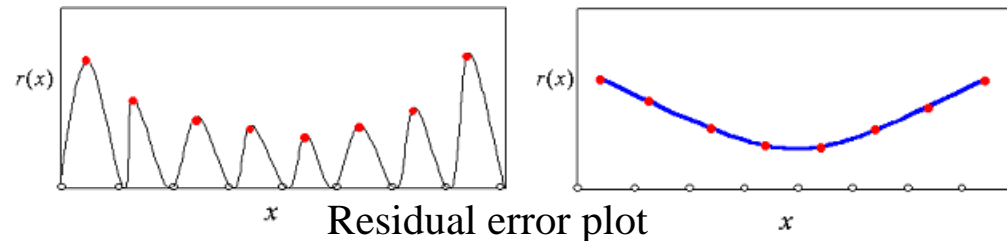
a) **exact** solution error for the local formulation and 3<sup>rd</sup> app.order

b) solution error for the local formulation and 3<sup>rd</sup> app.order **estimated** by the MLPG5

# Multipoint error analysis

- Residual error distribution**

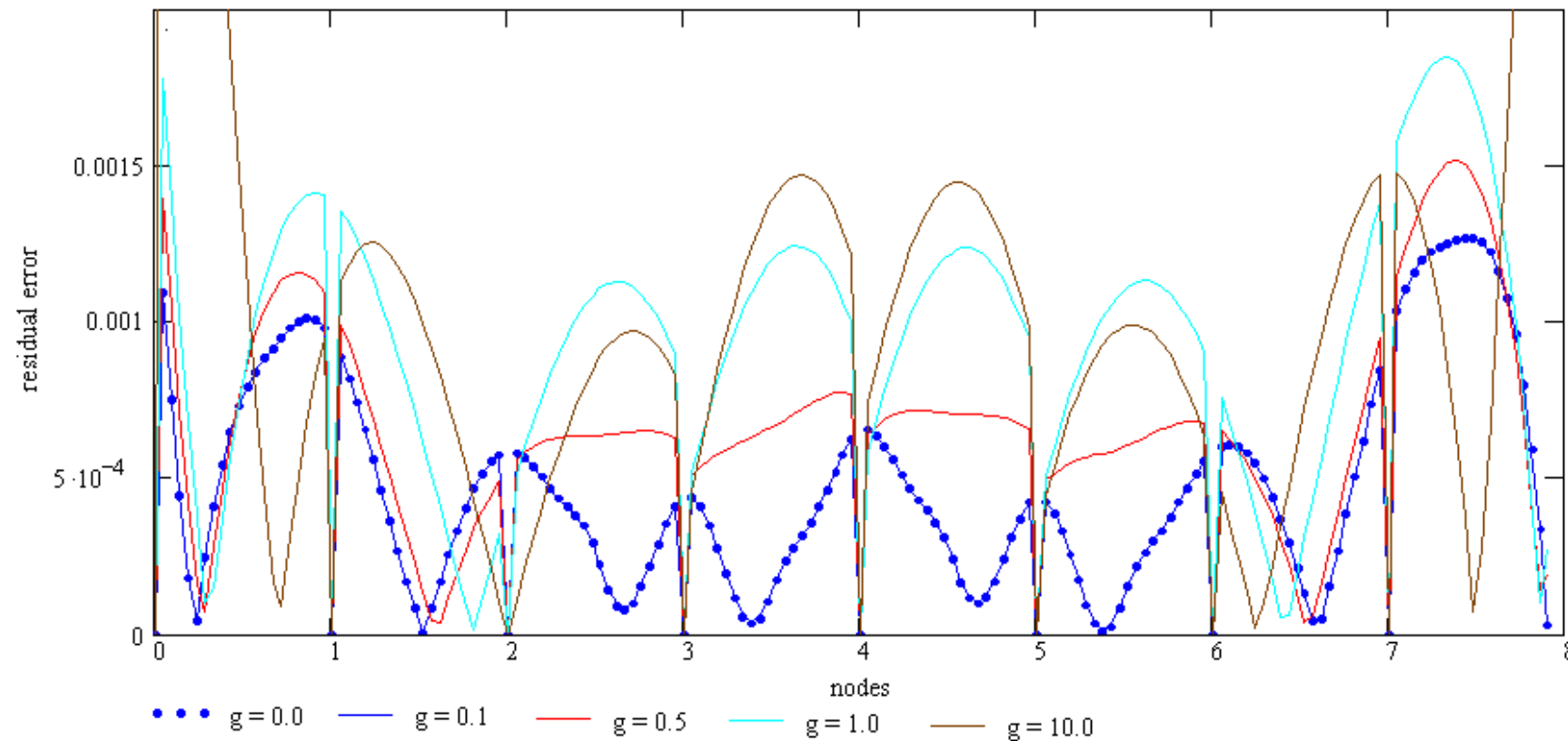
$$r^L = Lu^L - f \quad r^H = Lu^H - f$$



**Residual error distribution** using 1, 9, and 19 points between nodes. Test 2.

# A posteriori error analysis

- **Residual error**



**Residual error distribution** using 19 points between nodes.

The influence of the MWLS weighting factor  $g$

Smaller  $g$  provides smaller errors

$${}^k w_{ij}^2 = \left( \rho_{ij}^2 + \frac{g^4}{\rho_{ij}^2 + g^2} \right)^{-p+k-1}$$

# Multipoint error analysis

- Smoothing

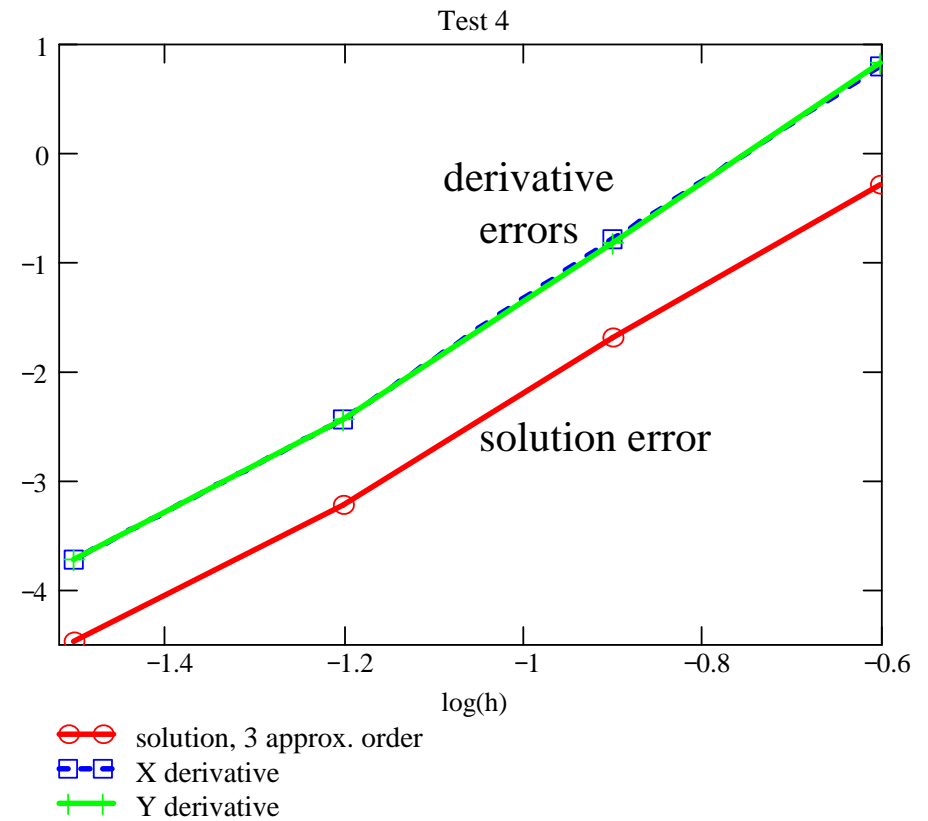
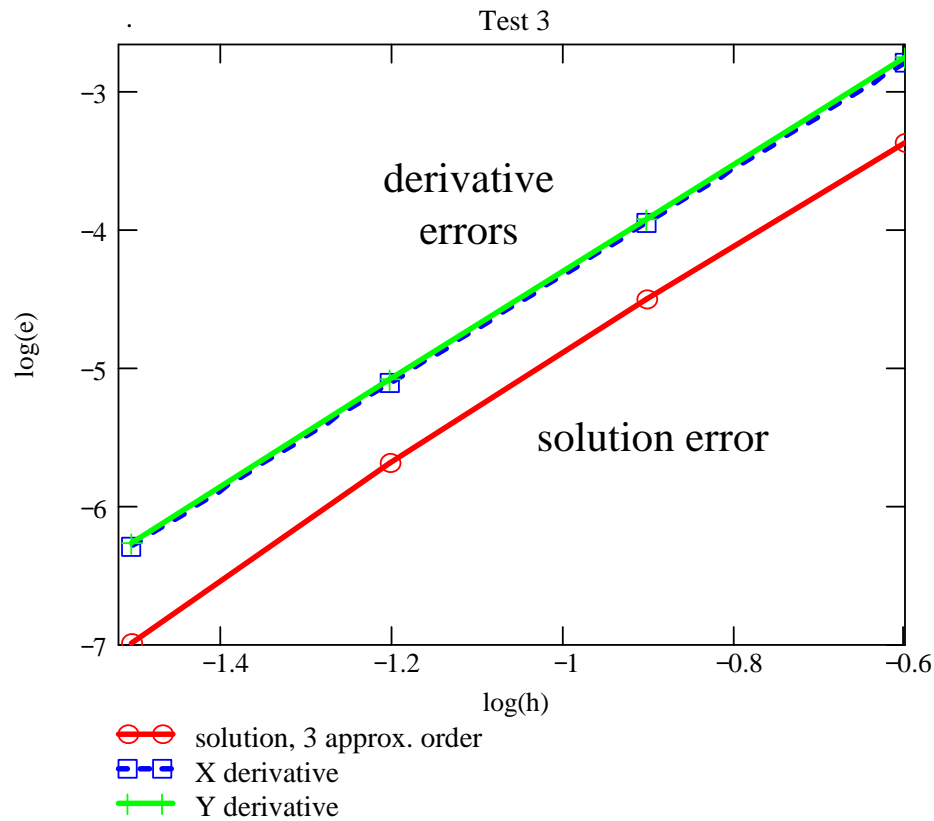
Specific case

$$\mathbf{u}^{(k)} = \mathbf{C} \mathbf{u} + \alpha \mathbf{f}$$

General case

$$\mathbf{u}^{(k)} = \mathbf{A} \cdot \mathbf{u}$$

Zienkiewicz-Zhu type error estimator  $e^{TH} = u'^T - u'^H$   $e^{LH} = u'^L - u'^H \approx e^{TL}$



Derivatives – true error convergence

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# Final remarks

- Presented was a posteriori error analysis based on the **Multipoint** Meshless Finite Difference Method (MMFDM).
  - The MMFDM may provide **high quality reference solutions** for a posteriori error estimation.
  - The following solution combinations may be done:
    - **HO multipoint** one vs. **lower order** standard (MFDM or FEM) solution  $u^H - u^L$
    - **Two different HO multipoint** solutions, e.g.  $p+1$  and  $p+2$ , presenting various use of **higher order** approximations
  - **Various types of a posteriori error estimation**, including **hierarchical**, **residual** and **Zienkiewicz-Zhu** approaches, may be carried out when supported by the Multipoint MFD method, and applied to both **irregular and regular meshes**.
  - Numerous tests carried out present **encouraging, high quality results** of such error analysis. However, results of the **residual** error analysis carried out between nodes show **strong dependence** of the error value on the choice of the used MWLS **smoothing weight factor** value  $g$ .
  - Further development and testing of this approach seems to be justified.
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***Thank you very much  
for your attention!***

