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***Multigrid Methods for Partial Differential Equations:
Basic Algorithmic Components***

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Multigrid Methods for Partial Differential Equations: Basic Algorithmic Components

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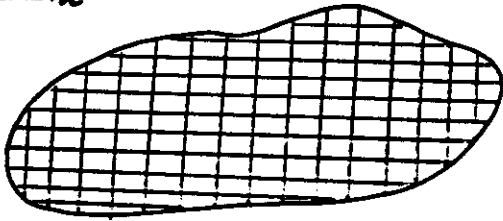
This talk gives a survey on the basic structures of multigrid algorithms for solving partial differential equations. It introduces into the underlying ideas and the related terminology.

- The basic idea: Smoothing and coarse grid correction
- The 2-grid iteration: linear and nonlinear problems
- The multigrid iteration
- The multigrid components
- The Full-Multigrid Method

Partial Differential Equation: Boundary value problem

$$\begin{aligned}Lu &= f & (\Omega) \\Bu &= g & (\partial\Omega)\end{aligned}$$

Grid G_h :



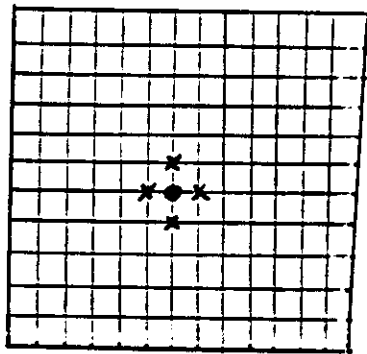
Discrete Formulation:

$$\begin{aligned}L^h u^h &= f^h & \text{"interior eqn."} \\B^h u^h &= g^h & \text{"boundary eqn."}\end{aligned}$$

Example: Laplace equation

$$\begin{aligned}-\Delta u &= f & (\Omega = (0,1)^2) \\u &= g & (\partial\Omega)\end{aligned}$$

Square cartesian grid $G_h = \{(i_h, j_h) : 0 \leq i, j \leq n\}$, $h = 1/n$



Finite Difference or Finite volume Formulation:

$$\begin{aligned}\frac{1}{h^2} \begin{bmatrix} & & -1 & & \\ & -1 & 4 & -1 & \\ & & -1 & & \\ & & & & \end{bmatrix}_{ij} u_{ij}^h &= f(i_h, j_h) & (G_h \cap \Omega) \\ &= g(i_h, j_h) & (G_h \cap \partial\Omega)\end{aligned}$$

The Basic Observation:

- Conventional relaxation schemes (e.g. Gauss-Seidel, damped Jacobi, SOR, ...) converge only very slowly.
- Their convergence speed decreases with h (mesh size)
- Conventional relaxation schemes are very efficient in smoothing errors.
- i.e. The amplitudes of high frequency Fourier components of the initial error

$$v^h = u^h - u^h$$
 are strongly reduced by one (or only a few) relaxation sweep.
- This smoothing property does usually not depend on h .

Notation: $S^v(u^h, L^h, f^h)$: v steps (or sweeps) of a relaxation scheme for $L^h u^h = f^h$ starting from initial approximation u^h .

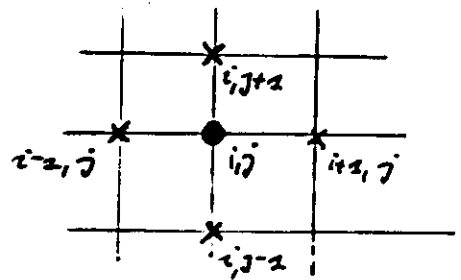
- Quantitative Analysis of smoothing properties of general relaxation schemes by

Local Mode Analysis

Example: Gauss-Seidel relaxation for the 5-point Laplacian

The discrete problem: (see above)

$$\frac{1}{h^2} \begin{bmatrix} -1 & 1 & -1 \\ -1 & 4 & -1 \\ -1 & -1 & 1 \end{bmatrix}_{ij} u^h = f^h, \quad 1 \leq i, j \leq n-1$$



The relaxation:

for $i = 1, \dots, n$ and $j = 1, \dots, n$:

$$u_{ij}^h \leftarrow \frac{1}{4} (u_{i-2,j}^h + u_{i+2,j}^h + u_{i,j-2}^h + u_{i,j+2}^h + h^2 f_{ij}^h)$$

↑
"replace"

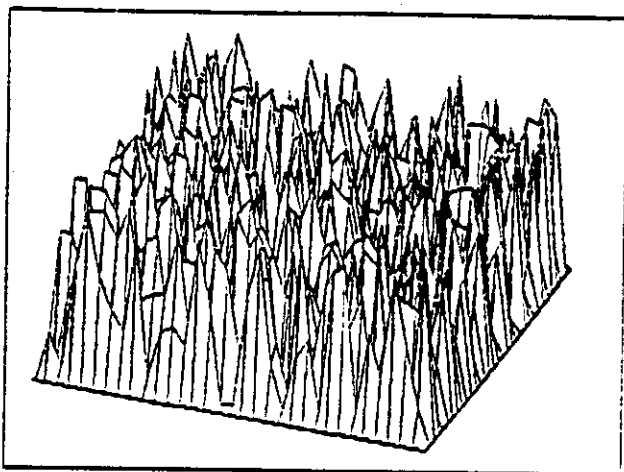
or in terms of the error $v_{ij}^h := u_{ij}^h - u_{ij}$

$$v_{ij}^h \leftarrow \frac{1}{4} (v_{i-2,j}^h + v_{i+2,j}^h + v_{i,j-2}^h + v_{i,j+2}^h)$$

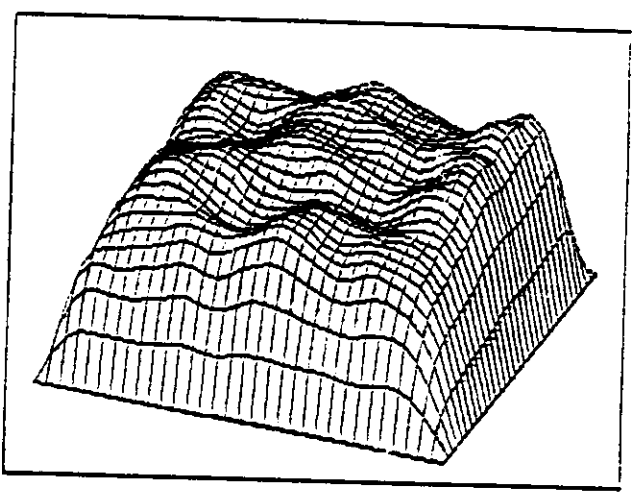
- averaging process \Rightarrow Smoothing property

Gauss-Seidel relaxation

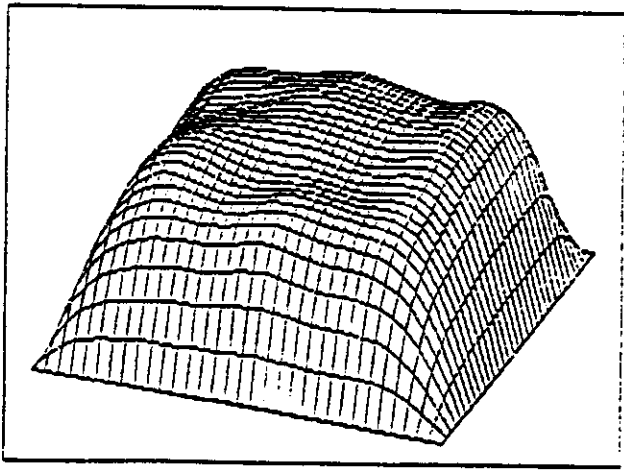
5-point Laplacian
Square Cartesian mesh



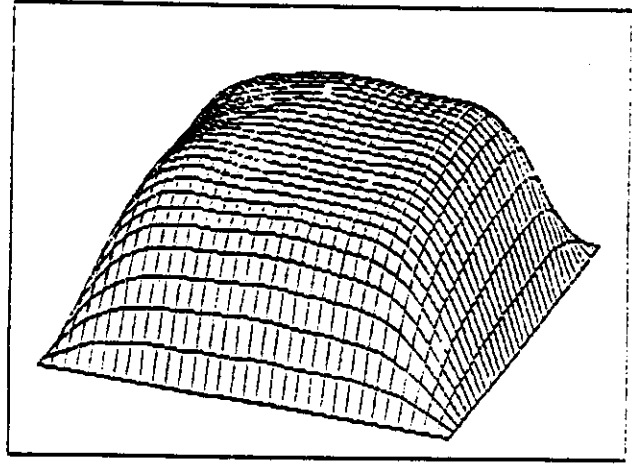
error of initial approximation



error after 5 relaxations



error after 10 relaxations



error after 15 relaxations

The 2-level method

Discrete problem: $L^h u^h = f^h$ Linear
on grid h

initial approximation: u_0^h

initial error: $v_0^h = u^h - u_0^h$

ν relaxation sweeps: $u_\nu^h = S^\nu(u_0^h; L^h, f^h)$

error after ν sweeps: $v_\nu^h = u^h - u_\nu^h$ Smooth

Correction equation: $L^h v_\nu^h = \underbrace{f^h - L^h u_\nu^h}_{\text{residual or defect}}$ (*)

- Due to the smoothness, $v_\nu^h = v_\nu^h$ can be approximated on a coarser grid H (e.g. $H = 2h$).

This coarse grid approximation is denoted by v^H .

Coarse grid correction equation:

$$L^H v^H = I_h^H (f^h - L^h u_\nu^h) \quad (**)$$

- (*) is a "representation" of (*) on the coarser grid H .
- L^H is the "coarse grid operator"
- I_h^H is a (linear) mapping from grid h to grid H and is called

restriction or residual transfer

2-level method: $u_h \rightarrow \bar{u}_h$

Linear case

$$u^h \leftarrow S^{\nu_2}(u^h; L^h, f^h)$$

$$d^h := f^h - L^h u^h$$

$$\bar{u}^h := u^h \leftarrow S^{\nu_2}(\tilde{u}^h; L^h, f^h)$$

$$\tilde{u}^h = u^h + \tilde{v}^h$$

$d^H := I_H^H d^h$
Restriction

$\tilde{v}^h := I_H^h v^H$
Interpolation

$$\text{Solve } L^H v^H = d^H$$

- I_H^h is a mapping from grid H to grid h, called "Interpolation" (or correction transfer or prolongation)
- For the above 2-level method, the assumption of linearity for L^h is essential (superposition principle used)
- The above scheme is called Correction Scheme (C_F^1), because only corrections are computed on the coarse grid.
- In the way the method has been presented so far, it is a general algorithmic scheme rather than a well defined iterative method. For concrete problems the components of the method have still to be chosen properly (depending on the problem):
 - relaxations S^1
 - restrictions I_H^H
 - interpolations I_H^h
 - coarse grid operator L^H

Multigrid Iterations (or Multigrid Cycling)

→ more than 2 levels

- in both versions, CS and FAS, the coarse grid problems have the form $L^H u^H = f^H$

with the coarse grid operator L^H (linear or nonlinear) and a given right hand side f^H .

- in multigrid iterations, this problem is solved again by (2-level-) multigrid using still coarser grids, ...

→ Recursive Definition of a Multigrid Cycle:

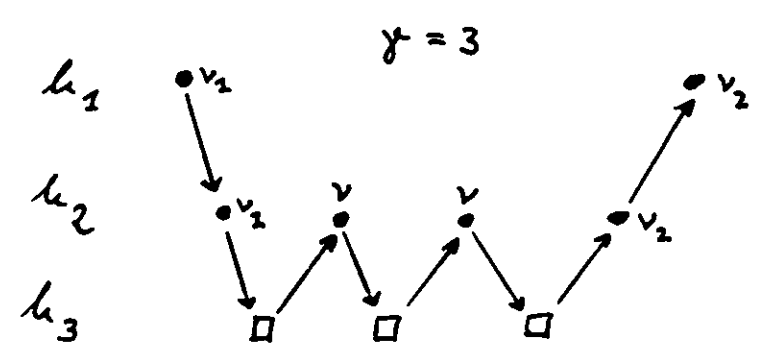
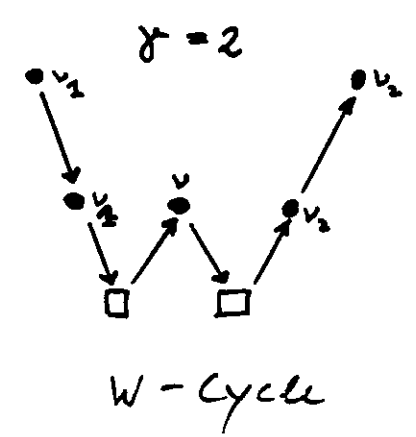
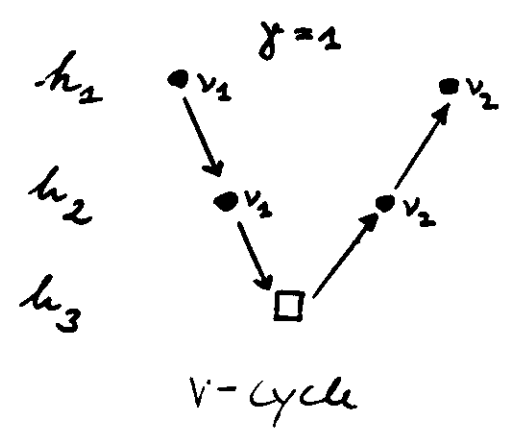
① A multigrid cycle $C(\gamma, \nu_1, \nu_2)$ over 2 grids is the 2-level method with ν_1 pre-smoothing and ν_2 post-smoothing steps.

② A multigrid cycle $C(\gamma, \nu_1, \nu_2)$ over a hierarchy of grids $h = h_1 < h_2 < \dots < h_m$ consists of

- (i) ν_1 pre-smoothing steps on grid h_1
- (ii) Restriction to next coarser grid h_2
- (iii) γ multigrid cycles $C(\gamma, \nu_1, \nu_2)$ over the grids $h_2 < \dots < h_m$
- (iv) Interpolation of corrections from grid h_2 to h_1
- (v) ν_2 post-smoothing steps on grid h_1

- γ is called the cycling parameter
- for large γ the multigrid cycle "approximates" the 2-level method

Examples: Cycles over 3 grids; $V := V_2 + V_2$



- Smoothing steps (relaxations)
- (exact) solution on coarsest grid
- ↓ Restriction (fine to coarse)
- ↑ Interpolation (coarse to fine)

$$\sum_{v=0}^{\infty} 9^v = \frac{1}{1-9}$$

$\frac{1}{8}$

Computational work of multigrid cycles

- 2D case, standard coarsening $h, 2h, 4h, \dots$

$$j=1 : (v_1 + v_2) \cdot \frac{4}{3}$$

$$j=2 : (v_1 + v_2) \cdot 2$$

$$j=3 : (v_1 + v_2) \cdot 4$$

Remark on Computational Work:

- Let $W :=$ computational work of one relaxation
Sweep over the finest grid "Work unit"
 $W = O(N)$ with $N =$ number of gridpoints
- Consider a hierarchy of grids where the number of gridpoints decreases by a fixed factor k
e.g. Standard coarsening $h, 2h, 4h, \dots$
then in 1D problems: $k=2$
2D problems: $k=4$
3D problems: $k=8$
- Then: Neglecting the computational work for transfers between grids and for solving the problem on the very coarsest grid, the asymptotic computational work (i.e. number of grids $\rightarrow \infty$) for a $C(\gamma, \nu_1, \nu_2)$ cycle is

$$W \cdot \nu \sum_{n=0}^{\infty} \left(\frac{\gamma}{k}\right)^n, \quad \nu_1 = \nu_1 + \nu_2.$$

\Rightarrow in case of standard coarsening

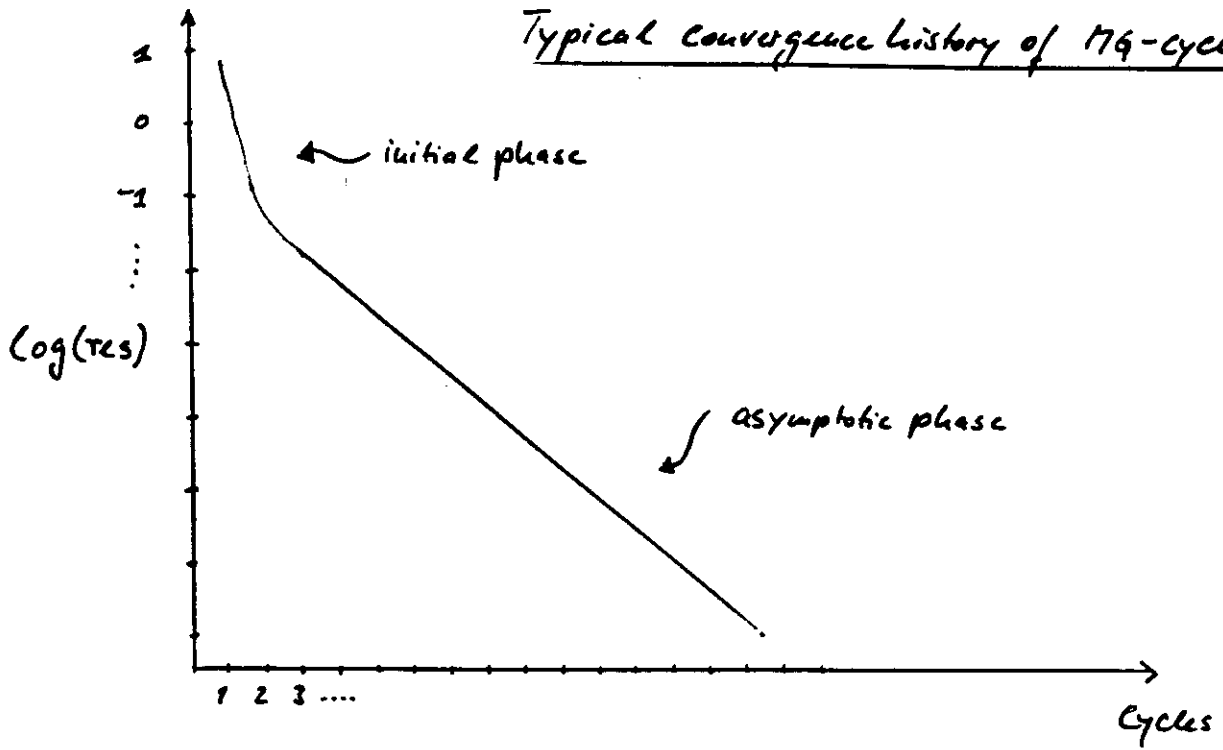
in 1D only $\gamma=1$ admissible

2D only $\gamma=1, 2, 3$ "

3D only $\gamma=4, \dots, 7$ "

- Note: The computational work increases drastically with γ !
- in practice: $\gamma=1$ or (more robust) $\gamma=2$

Typical convergence history of 176-cycling

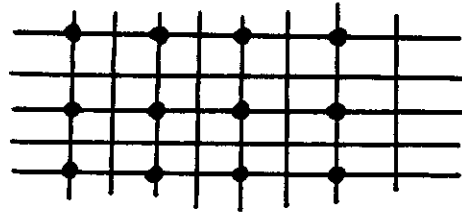


- typically: independent of h !

Some Multigrid Components

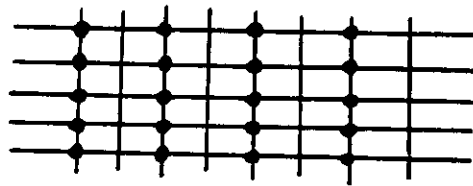
① Coarsening Strategy:

(i) Standard Coarsening $h, 2h, 4h, \dots$



• coarse grid

(ii) Semi coarsening (i.e. coarsening only in some directions)



Coarsening in x-direction only

- more computational work on coarser grids
- sometimes preferable in cases of anisotropies

② Relaxations: The most sensitive component in a multigrid method.

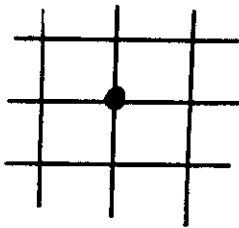
The choice of a proper relaxation depends on the problem. The relaxation must strongly reduce high frequency error components which are not "visible" on the coarser grids.

Note: This set of components depends on the coarsening strategy.

More about relaxation in the talk about local mode smoothing analysis.

③ Intopolations and Residual Transfers

- Intopolation of corrections from coarse to fine grid typically by polynomial interpolation
e.g. linear intopolation
- Residual transfers:
 - Simplest possibility: injection
(if the coarse gridpoints also belong to the fine grid)
 - Standard Full Weighting



$$I_h^{2h} = \frac{1}{16} \begin{bmatrix} 1 & 2 & 1 \\ 2 & 4 & 2 \\ 1 & 2 & 1 \end{bmatrix}$$

- averaging operator
provides additional smoothing for the residuals

Remark: Intopolation and residual transfer operators must not be choosen independently. There is a rule on the "orders" of these operators which results from a theoretical Fourier analysis of the 2-level operator. For scalar equations it's roughly the following:

$$\text{Order (intopolation)} + \text{Order (residual transf.)} \geq m$$

Where m is the order of the differential equation.

L (11)

- a definition of the term "order" cannot be given here

(see. A. Brandt, Guide '84; p. 52-54)

But examples:

- Linear interpolation : order 2
- Cubic interpolation : order 4
- Injection : order 0
- Full-Weighting : order 2

⇒ for 2nd order boundary value problems
linear interpolation / injection
is the cheapest correct choice.

④ A remark on coarse grid operators L^H :

Generally: L^H should approximate L^h quite well.

• standard approach: $L^H =$ proper discretization of the differential operator L on coarse grid H .

• Alternative: "Galerkin Operators": $L^H := I_h^H L^h I_H^h$

Here, L^H is algebraically defined by the (given) fine grid operator L^h and by the transfers between the grids.

Needed in cases where a differential operator L is not available (→ see algebraic multigrid).

Galerkin operators are also considered for theoretical purposes in connection with algebraic convergence proofs.
(e.g. McCormick, Brandt, Wesseling, ...)

The Full Multigrid Method:

- the above multigrid cycling is an iterative method which converges an initial approximation given on the finest grid to the exact discrete solution.
- in a Full Multigrid Method, the initial approximation on a fine grid is obtained by interpolation of a solution from the next coarser grid.

Definition of the nFMG (γ, ν_1, ν_2) - Method

Given a hierarchy of grids with meshsizes $h_2 < \dots < h_m$

- ① on the coarsest grid h_m solve the discretized problem
- $$L^{h_m} u^{h_m} = f^{h_m}$$

- ② for $k = m-1, \dots, 1$ do

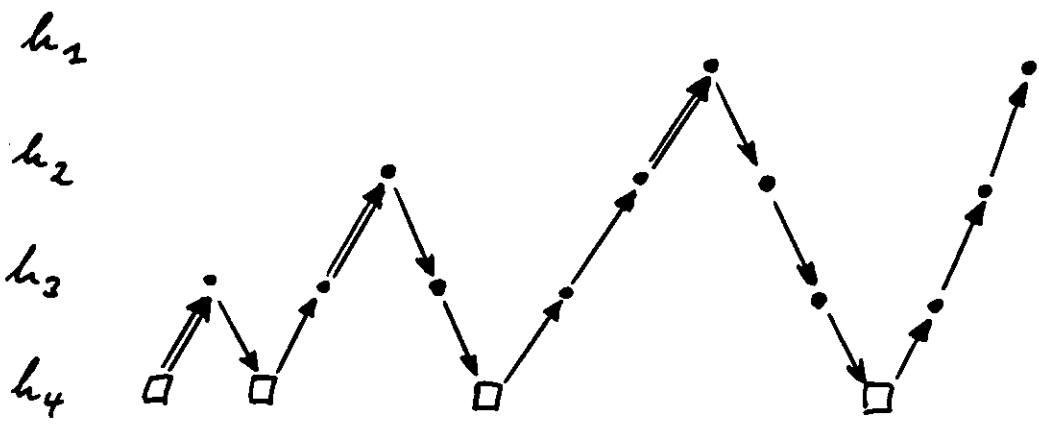
(i) $u^{h_k} \leftarrow \prod_{k+1}^m u^{h_{k+1}}$: initial approximation on grid h_k by interpolation.

- (ii) Starting with this u^{h_k} as initial approximation on grid h_k perform

n multigrid cycles $C(\gamma, \nu_1, \nu_2)$ over the grids h_{k+1}, \dots, h_m .
 \rightarrow new u^{h_k}

- \mathbb{I}_{K+1}^K is an interpolation from grid $K+1$ to the next finer grid K (similar to the interpolation within the multigrid cycle, not necessarily the same). It is called "FMG - interpolation"

Example: 1FMG $(2, \nu_1, \nu_2)$: i.e. FMG with V-Cycles



↗ FMG - interpolation

- relaxations
- Solution on coarsest grid
- ↘ residual transfer (restriction)
- ↗ correction transfer (interpolation)

- The main idea behind FMG is to compute approximations with an accuracy of the order of the truncation error.

i.e. let u be the continuous solution of $L u = f$ and u^h the discrete solution of $L^h u^h = f^h$ on the finest grid.

Then: FMG produces an approximation u^h with

$$\textcircled{*} \quad \| u^h - u^h \| \leq \underbrace{\| u - u^h \|}_{\text{"Truncation error"}}$$

(— provided that the multigrid parameters and components are chosen properly).

e.g.: the order of the FMG-interpolation should always be \geq the order of the discretization

(see A. Brandt, Guide '84, p. 73)

- Because the convergence of the multigrid cycling is independent of h , only a fixed number of cycles per level is sufficient to achieve $\textcircled{*}$.
- With a fixed number of cycles per level the computational complexity of FMG is optimal.
 - i.e. the number of arithmetic operations needed in FMG is proportional to the number of gridpoints on the finest grid.

