

# Multi-grid for Linear Problems (LCS Scheme)

- First discuss a multi-grid algorithm for linear problems: *Linear Correction Scheme* or LCS.
- Can be applied to essentially any elliptic system, but may be useful to think in terms of two dimensional model problem
- First note that multi-grid algorithms generally involve solutions of sets of equations of form

$$L^\ell u^\ell = s^\ell \quad (87)$$

where ‘right-hand-side’ or “source” function,  $s^\ell$ , may *not* coincide with source function  $f^{\ell_{\max}}$  from fine-grid problem

$$L^{\ell_{\max}} u^{\ell_{\max}} = f^{\ell_{\max}} \quad (88)$$

- Also note that will ignore the role of (discretized) boundary conditions in the discussion of multi-grid techniques.
- However, especially for non-Dirichlet conditions, treatment of boundary conditions in multi-grid is non-trivial (see supplied references)

# Multi-grid for Linear Problems (LCS Scheme)

- Begin discussion of LCS scheme assuming that grid hierarchy has just two grids: fine grid with mesh spacing  $h$ , defines problem of interest

$$L^h u^h = f^h, \quad (89)$$

and coarse grid with mesh spacing  $2h$ : serves as “accelerator” of fine grid solution process.

- Denote by  $\tilde{u}^h$  current approximation to  $u^h$ ,
- Given some initial estimate of  $\tilde{u}^h$ , start by applying relaxation: for concreteness (as well as the fact that it is commonly used in practice), assume that are using Gauss-Seidel relaxation with red-black ordering (RBGS).
- Then, after a few sweeps (perhaps as few as 1 or 2!), will find that the residual,  $\tilde{r}^h$

$$\tilde{r}^h := L^h \tilde{u}^h - f^h \quad (90)$$

as well as the error

$$\tilde{e}^h := u^h - \tilde{u}^h \quad (91)$$

will be *smooth* on the scale of the mesh.

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- Now think of task of completing fine-grid solution, equivalently, driving the residual,  $\tilde{r}^h$ , to 0, in terms of computing a *correction*,  $v^h$ , such that

$$u^h = \tilde{u}^h + v^h \quad (92)$$

- Due to linearity of  $L^h$ , correction satisfies

$$L^h v^h = -\tilde{r}^h \quad (93)$$

- By assumption, residual,  $\tilde{r}^h$  is smooth: therefore so must be the correction,  $v^h$  (this reasonably assumes that  $L$  and  $L^h$  are “well-behaved”).
- First key observation underlying LCS is that this smoothness in the residual and correction means that can *sensibly* pose a coarse-grid version of (93).

# Multi-grid for Linear Problems (LCS Scheme)

- That is, now consider coarse grid problem

$$L^{2h}v^{2h} = -I_h^{2h}\tilde{r}^h \equiv s^{2h}, \quad (94)$$

- $L^{2h}$  is the coarse-grid difference operator (which employs the same FDA as  $L^h$ )
- $I_h^{2h}$  is a fine-grid-to-coarse-grid transfer operator known as a *restriction operator* (details discussed later).
- Now assume that we have computed an (approximate) solution,  $\tilde{v}^{2h}$ , of (94).

- Then update  $\tilde{u}^h$  via

$$\tilde{u}^h := \tilde{u}^h + I_{2h}^h \tilde{v}^{2h} \quad (95)$$

- $I_{2h}^h$  is a coarse-to-fine transfer operator, i.e. a prolongation operator, not necessarily the same as the prolongation operator  $\bar{I}_{2h}^h$  discussed previously.

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- However,  $I_{2h}^h$  will typically also involve polynomial interpolation
- Interpolation of computed correction,  $\tilde{v}^{2h}$ , to fine grid will introduce new high-frequency components in residual and solution error.
- But these high-frequency components can be effectively annihilated with a few more relaxation sweeps
- At this point, *all* components of the residual will have been substantially reduced.
- Sequence of posing coarse grid problem, solving it, then updating the fine grid unknown is known as a coarse-grid correction (CGC).
- Next key observation is that can apply the smooth/CGC/smooth process to solve the coarse grid problem (94) itself, then keep recursing, solving problems with mesh spacings,  $4h$ ,  $8h$ , etc.
- Eventually get to the *coarsest* level: problem there is so small (perhaps  $3 \times 3$  unknowns, including boundary values!) that it is computationally *trivial* to *solve* the problem (not just smooth it) using relaxation.
- Solution of coarse grid problem then followed by succession of coarse-to-fine transfers of various coarse grid corrections that have been computed

# Multi-grid for Linear Problems (LCS Scheme)

- Apply post-CGC relaxation sweeps after each restriction operation to ensure that high-frequency components (re)-introduced by restriction are killed off
- Process of working from finest to coarsest grid then back to finest grid is known as *multi-grid V-cycle*
- Important question: How many relaxation sweeps should be applied before and after each coarse-grid correction?
- Answer generally depends on specifics of problem, but typically introduce parameters,  $p$  and  $q$ :

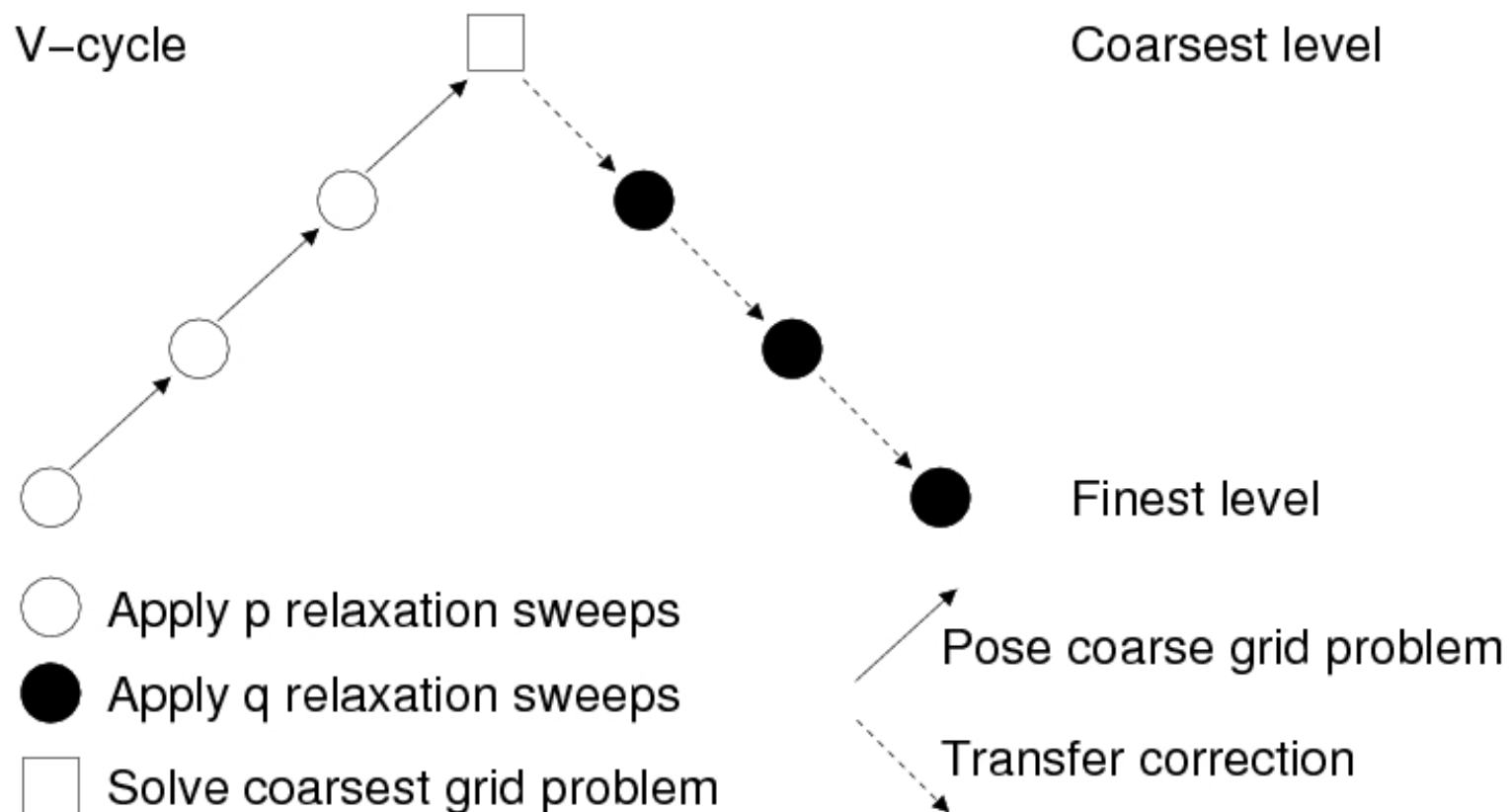
$$p \equiv \text{number of pre-CGC sweeps} \quad (96)$$

$$q \equiv \text{number of post-CGC sweeps} \quad (97)$$

and then set  $p$  and  $q$  to specific values.

- Results in what is known as a *fixed V-cycle* algorithm (pseudo-coded later)

# LCS Multi-grid V-cycle



- Schematic representation of a LCS multi-grid  $V$ -cycle, for the case of 4-level mesh hierarchy.
- Open and filled circles represent pre- and post-CGC relaxation sweeps, respectively; open square denotes *solution* of the coarse-grid problem.
- Intergrid transfers are represented by the two different types of arrows.

# Multi-grid for Linear Problems (LCS Scheme)

- Experience shows that, assuming initial estimate of  $\tilde{u}^h$  was good (as should be the case if we are using a multi-level strategy), then will find

$$\|\tilde{r}^h\| \sim \|\tau^h\| \quad (98)$$

after a single  $V$ -cycle, and fine grid problem will be effectively solved.

- If need smaller residual, apply additional  $V$ -cycles: residual size should go down by constant factor (perhaps 10) per cycle
- Finally, in case of multiple  $V$ -cycles, no need to perform pre-CGC smoothing sweeps on the finest level except for *first*  $V$ -cycle



# Pseudo-code for LCS V-cycle

```
procedure lcs_vcycle ( $\ell$ , cycle,  $p$ ,  $q$ )  
  Cycle from fine to coarse levels  
  do  $m = \ell, 2, -1$   
    if cycle = 1 or  $m \neq \ell$  then  
      Apply pre-CGC smoothing sweeps  
      do  $p$  times  
         $u^m := \text{relax\_rb}(u^m, s^m, h^m)$   
      end do  
      Set up coarse grid problem  
       $u^{m-1} := 0$   
       $s^{m-1} := -I_m^{m-1}(L^m u^m - s^m)$   
    end if  
  end do  
  Solve coarsest-level problem  
   $u^1 := \text{relax\_rb}(u^1, s^1, h^1)$  until  $\|\tilde{r}^1\| \leq \epsilon_1$ 
```

# Pseudo-code for LCS V-cycle (cont.)

*Cycle from coarse to fine levels*

**do**  $m = 2, \ell, +1$

*Apply coarse-grid correction*

$$u^m := u^m + I_{m-1}^m u^{m-1}$$

*Apply post-CGC smoothing sweeps*

**do**  $q$  **times**

$$u^m := \text{relax\_rb}(u^m, s^m, h^m)$$

**end do**

**end do**

**end procedure**

- Note: have introduced an additional parameter,  $\epsilon_1$ , which is the convergence criterion to solve the coarsest-grid problem by relaxation.
- Cost of relaxation on coarsest grid is typically so small compared to the fine grid work:  $\epsilon_1$  can typically be set quite conservatively with essentially no impact on algorithm performance

# Pseudo-code for LCS Driver Routine

```
procedure lcs_mg ( $l_{\max}$ , ncycle,  $p$ ,  $q$ )  
  do  $l = 1, l_{\max}, +1$   
    if  $l = 1$  then  
      On coarsest level, arbitrarily initialize solution to 0  
       $u^1 := 0$   
    else  
      Initialize solution via prolongation from coarse grid solution  
       $u^l := \bar{I}_{l-1}^l u^{l-1}$   
    end if  
    Initialize source function  
     $s^l := f^l$   
    Perform ncycle V-cycles  
    do cycle = 1, ncycle  
      lcs_vcycle ( $l$ , cycle,  $p$ ,  $q$ )  
    end do  
  end do  
end procedure
```