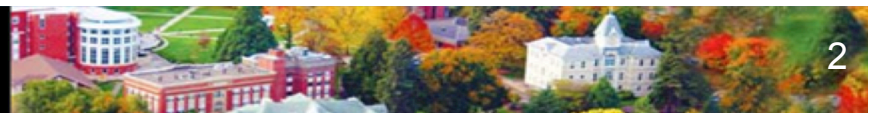


- Higher Order methods for hyperbolic systems
- Monotonicity as a measure for hyperbolic systems
- Flux limiters for bounded solutions



Higher Order Schemes

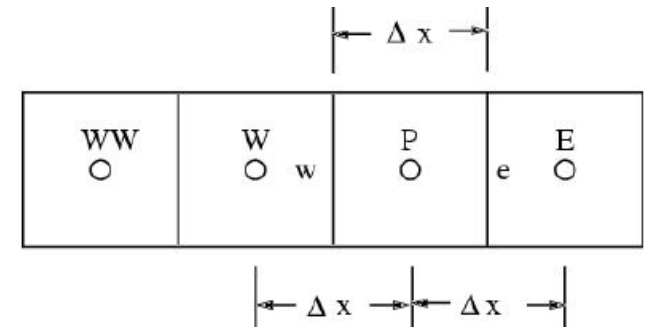
- Neither Upwind Difference Scheme (UDS) nor Central Difference Scheme (CDS) are satisfactory
- Upwind too dissipative, CDS is dispersive, explicit CDS is unstable!
- Variety of higher-order schemes
 - FROMM
 - Beam Warming
 - QUICK



Taylor Series Basis

- First order UDS

$$\phi_e = \phi_p$$



- think of this as truncation of Taylor Series

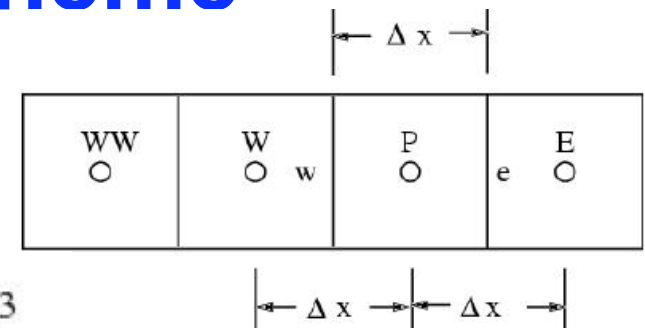
$$\phi(x) = \phi_P + (x - x_P) \frac{\partial \phi}{\partial x} + \frac{(x - x_P)^2}{2!} \frac{\partial^2 \phi}{\partial x^2} + O(\Delta x)^3$$

- What if we truncated to higher order?
- Note we are still using **upwinded differencing!**

Second-Order Scheme

- Taylor Series about P

$$\phi(x) = \phi_P + (x - x_P) \frac{\partial \phi}{\partial x} + \frac{(x - x_P)^2}{2!} \frac{\partial^2 \phi}{\partial x^2} + O(\Delta x)^3$$



- Truncate series after second term

$$\phi_e = \phi_P + \frac{\Delta x}{2} \frac{\partial \phi}{\partial x}$$

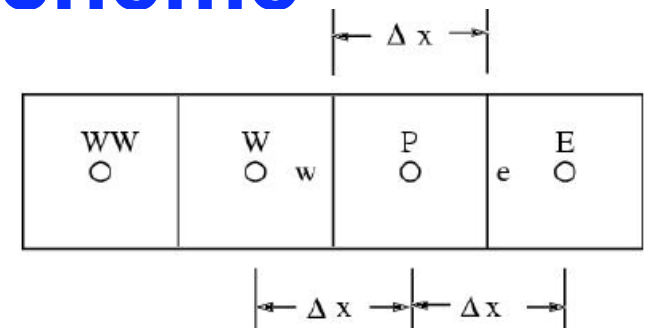
Truncation error : $O(\Delta x^2)$

- Several ways to approximate gradient
 - can write gradient @ P using forward, backward or central difference
 - gradient @ P should at least be order (Δx)

Basis of FROMM Scheme

- Central for the derivative @ P

$$\frac{\partial \phi}{\partial x} = \frac{\phi_E - \phi_W}{2\Delta x}$$



Truncation error : $O(\Delta x^2)$

- Thus

$$\phi_e = \phi_P + \frac{\Delta x}{2} \frac{\partial \phi}{\partial x} \quad \phi_e = \phi_P + \frac{(\phi_E - \phi_W)}{4}$$

- Add and subtract $\phi_P/4$

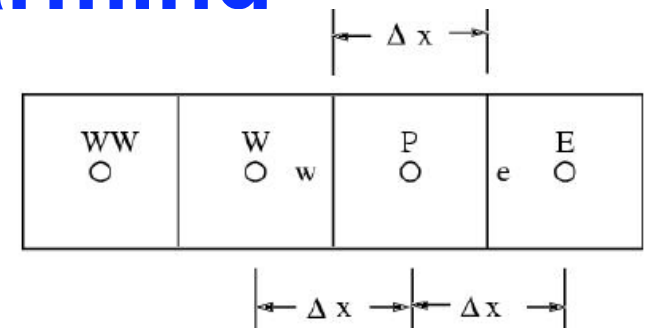
$$\phi_e = \phi_P + \frac{(\phi_P - \phi_W)}{4} + \frac{(\phi_E - \phi_P)}{4}$$

Basis of Beam-Warming

- Second order scheme. Upwinded gradient

$$\frac{\partial \phi}{\partial x} = \frac{\phi_P - \phi_W}{\Delta x}$$

Truncation error : $O(\Delta x)$



- Thus

$$\phi_e = \phi_P + \frac{\Delta x}{2} \frac{\partial \phi}{\partial x} \quad \frac{\partial \phi}{\partial x} = \frac{\phi_P - \phi_W}{\Delta x}$$

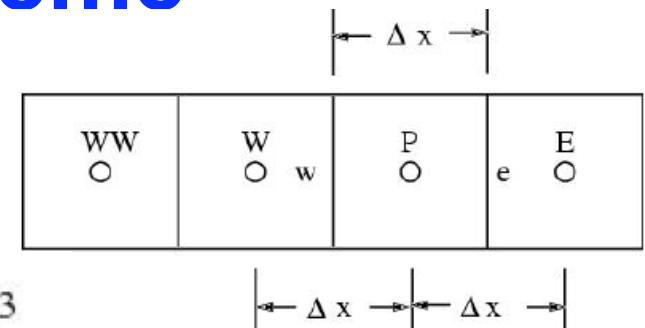
- Combining

$$\phi_e = \phi_P + \frac{(\phi_P - \phi_W)}{2}$$

Third-Order Scheme

- Taylor Series about P

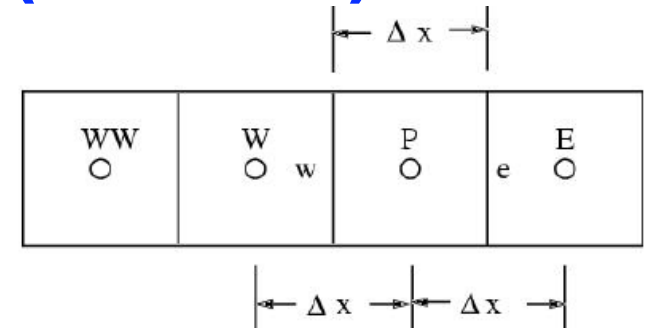
$$\phi(x) = \phi_P + (x - x_P) \frac{\partial \phi}{\partial x} + \frac{(x - x_P)^2}{2!} \frac{\partial^2 \phi}{\partial x^2} + O(\Delta x)^3$$



- Need to write first gradient @ P at least second-order accurate
- Need to write second gradient @ P at least first order accurate

Quadratic Upwind Interpolation for Convective Kinetics (QUICK)

- QUICK (central for first and second derivatives)



$$\frac{\partial \phi}{\partial x} = \frac{(\phi_E - \phi_W)}{2\Delta x} + O(\Delta x^2)$$

$$\frac{\partial^2 \phi}{\partial x^2} = \frac{(\phi_E + \phi_W - 2\phi_P)}{(\Delta x)^2} + O(\Delta x^2)$$

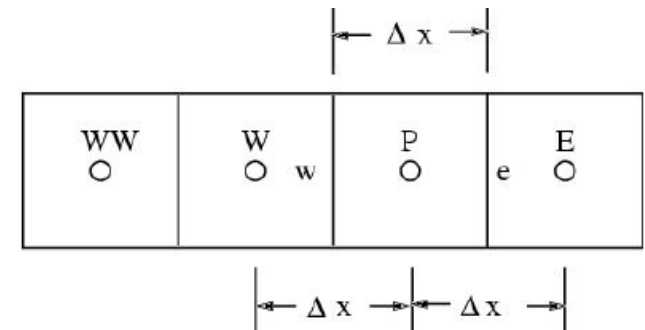
- Combining

$$\phi_e = \phi_P + \frac{(\phi_E - \phi_W)}{4} + \frac{(\phi_E + \phi_W - 2\phi_P)}{8}$$

$O(\Delta x^3)$ accurate

QUICK

- Rearranging



$$\phi_e = \frac{(\phi_E + \phi_P)}{2} - \frac{(\phi_E + \phi_W - 2\phi_P)}{8}$$

Central
difference
(linear)

Curvature term

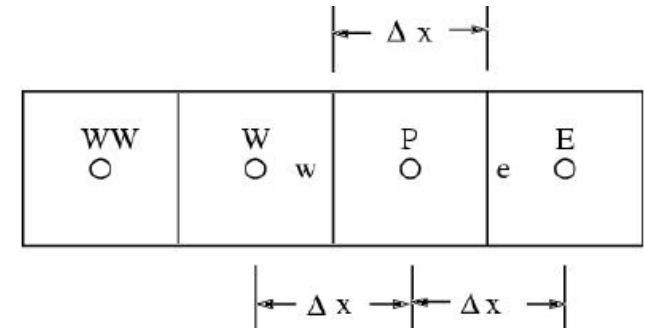
$$\phi_e = \frac{1}{2}(\phi_E + \phi_P) - C(\phi_E + \phi_W - 2\phi_P)$$

Curvature factor
 $C=1/8$

ALL Schemes Together

- Combined representation

$$\phi_e = \phi_P + \frac{(1 - \kappa)}{4}(\phi_P - \phi_W) + \frac{(1 + \kappa)}{4}(\phi_E - \phi_P)$$



$\kappa = -1$ Beam Warming scheme

$\kappa = 0$ Fromm scheme

$\kappa = 1/2$ QUICK

$\kappa = 1$ Central difference scheme

Higher-Order Schemes

- The schemes we saw provide higher-order accuracy; however, if used with explicit Euler (Forward Difference) in time, are **unconditionally unstable**!
- For steady convection problems, these schemes provide spatial oscillations
- Ways to counter these issues
 - Use implicit schemes for time discretization
 - Add extra terms from model equations to counter negative diffusion
 - Add even higher-order dissipation terms



Added Dissipation Schemes

- Want to keep truncation error (Δx^2) if using second-order schemes
- Add fourth-order term as added artificial dissipation

$$(\text{constant})\Delta x^3 \frac{\partial^4 \phi}{\partial x^4}$$

Note that artificial term is $O(\Delta x^3)$ – preserves $O(\Delta x^2)$ error



Added Dissipation Schemes

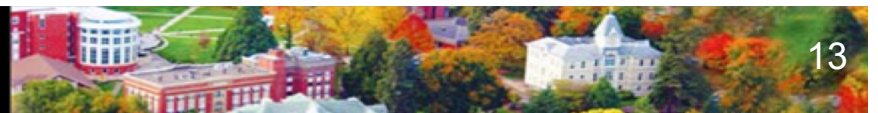
- Corresponding face value for CDS

$$\phi_e = \frac{\phi_P + \phi_E}{2} + \epsilon_e^{(+)} (\phi_{EE} - 3\phi_E + 3\phi_P - \phi_W)$$

- Near shocks and discontinuities need to added more dissipation

$$(\text{constant}) \Delta x^2 \frac{\partial^2 \phi}{\partial x^2}$$

Destroys second-order accuracy of scheme – reduces to first-order near shocks



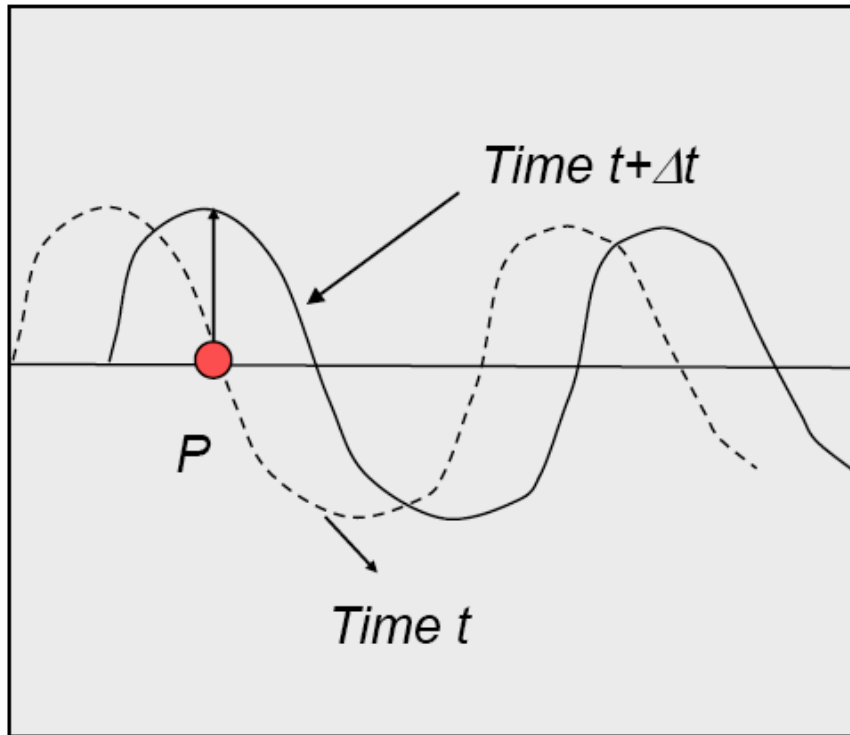
Monotonicity

- Symmetry of discretization and positivity of coeffs. was used as measure for physically correct behavior of schemes for parabolic and elliptic problems

$$a_P = \sum_{nb} a_{nb}; \quad a_{nb} > 0$$

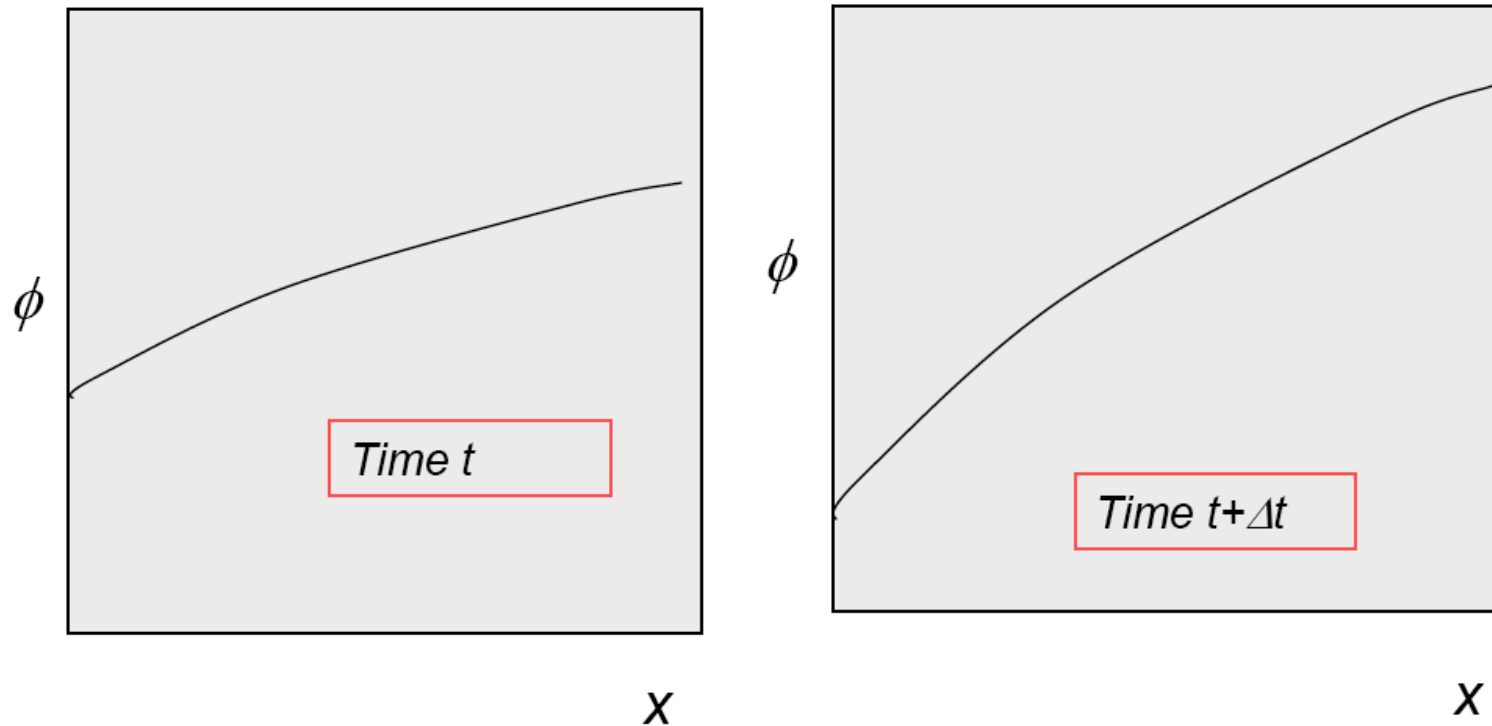
- This ensures bounded solutions
- For hyperbolic systems, boundedness is not a good (or sufficient) measure

Wave Transport



- As wave passes through point P , value @ P can exceed both the old time-level value and also the neighbor values!
- What properties should we impose on our numerical scheme for proper solution of the hyperbolic system?

Monotonicity Preservation



If $\phi(x,t)$ is monotonic in x , then $\phi(x,t+\Delta t)$ is also monotonic in x
No new maxima or minima are created

Godunov Theorem

- Sergei Godunov
- A consistent numerical scheme for the **linear wave equation** that is monotonicity preserving can **at most** be first order accurate
- key word is “linear”. Can come up with non-linear higher-order schemes



Total Variation

-For a hyperbolic system it can shown that the total variation (TV) does not increase with time

$$TV(\phi) = \int \left| \frac{\partial \phi}{\partial x} \right| dx$$

- For a traveling wave, the total variation will actually remain constant in the absence of diffusion and source terms in an infinite domain

- In presence of a diffusion term (and in absence of a source term), TV cannot increase

Total Variation

- TV is measure of wiggleness

$$TV(\phi) = \int \left| \frac{\partial \phi}{\partial x} \right| dx$$

- High frequency sine wave has more wiggleness and total variation than a low frequency one
- Corresponding discrete concept

$$TV = \sum |\phi_P - \phi_W|$$

Total Variation Diminishing (TVD) Scheme

- A numerical scheme is called total variation diminishing (TVD) if

$$TV(\phi) \leq TV(\phi^0)$$

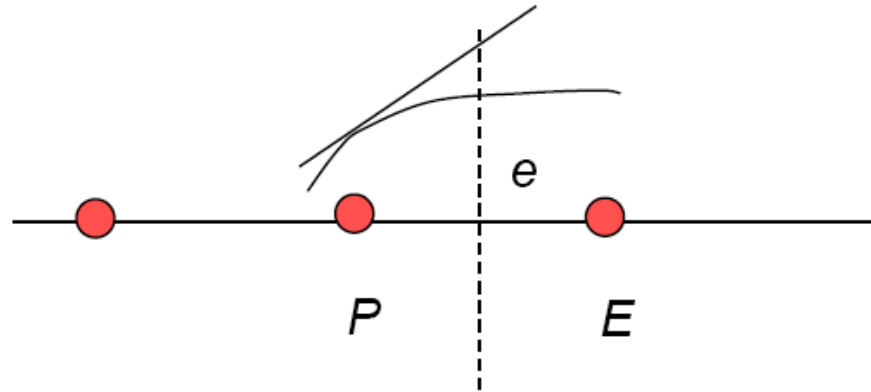
The diagram illustrates the TVD condition. It features two red-outlined rectangular boxes. The box on the left contains the text "Current time value". The box on the right contains the text "Old time value". A grey arrow points from the "Current time value" box up and to the right towards the equation $TV(\phi) \leq TV(\phi^0)$. Another grey arrow points from the "Old time value" box up and to the left towards the same equation. This visualizes that the total variation at the current time is less than or equal to the total variation at the old time.

A TVD Scheme is also monotonicity preserving (can be shown)

Local Extremum Diminishing (LED) Scheme

- TVD is a “weak” condition. Since total variation decreases, it is still possible to create locally small wiggles even though TV decreases overall
- A more stringent concept is that of LED
 - Create no new extrema
 - do not amplify existing extrema
 - LED schemes are TVD
 - this is done by looking at local gradients and “limiting” fluxes to ensure LED property
 - LED schemes can suffer from “clipping errors”

LED Example



- A second order scheme would obtain face value as

$$\phi_e = \phi_P + \frac{\Delta x}{2} \left(\frac{\partial \phi}{\partial x} \right)_P$$

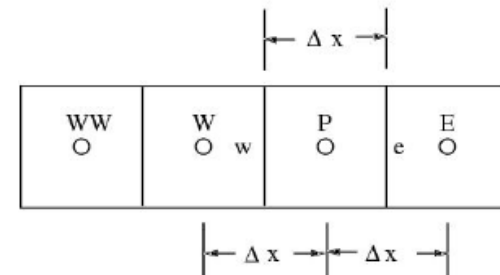
- this can cause local “overshoot”

LED with Limiters

-To avoid local creation of extrema, we employ a limiting function called “**limiter**” that ensures non-wiggly solution

- the face value is found as

$$\phi_e = \phi_P + \Psi(r_e) \frac{\Delta x}{2} \left(\frac{\partial \phi}{\partial x} \right)_P$$



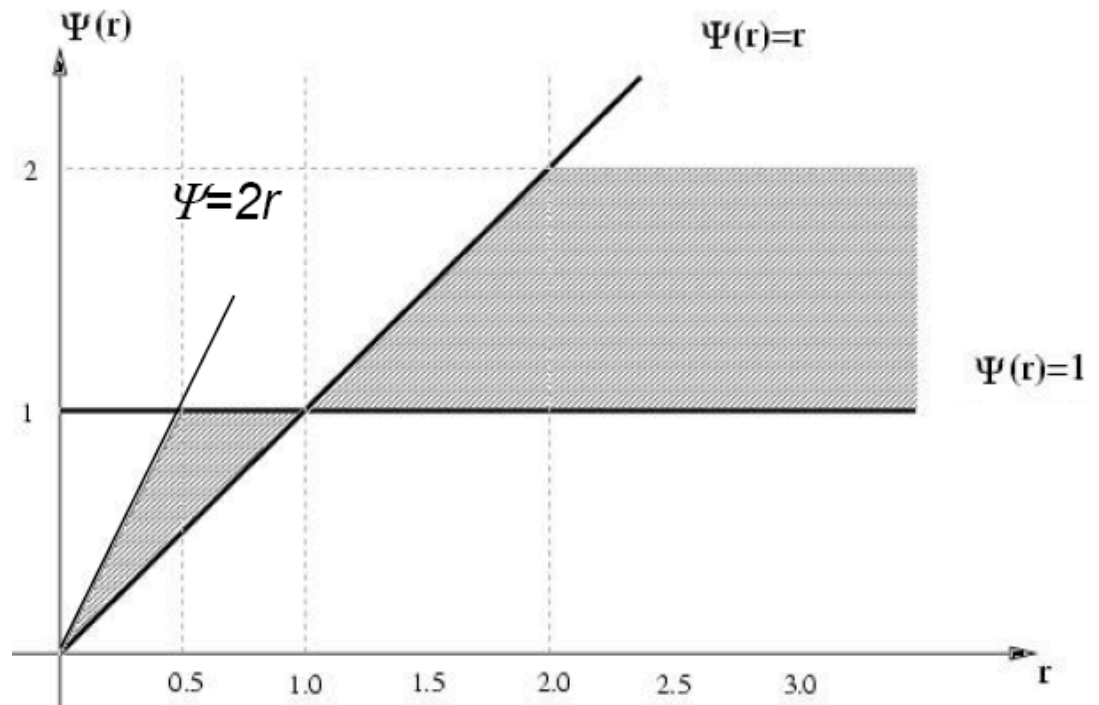
- using an upwind evaluation

$$\phi_e = \phi_P + \Psi(r_e) \frac{\Delta x}{2} \frac{(\phi_P - \phi_W)}{\Delta x}$$

$$r_e = \frac{\phi_E - \phi_P}{\phi_P - \phi_W}$$

Limiters

- limiter function chooses gradient adaptively to avoid creating new extrema
- to be LED scheme, it is possible to show that the limiter should occupy the gray region
- also it is desirable to have it pass through (1,1)



$$r_e = \frac{\phi_E - \phi_P}{\phi_P - \phi_W}$$

Downwind
cell gradient

Upwind cell gradient