

M.Sc. in Computational Science

Fundamentals of Atmospheric Modelling

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Lecture 12

Semi-Lagrangian Advection

Introduction

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- The criterion for stability was the CFL condition

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- For high spatial resolution (small Δx) this severely limits the **maximum time step** Δt that is allowed.
- In numerical weather prediction (NWP), **timeliness** of the forecast is of the essence.
- In this lecture, we study an alternative approach to time integration, which is **unconditionally stable** and so, free from restrictions of the CFL condition.

The Basic Idea

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In a *fully Lagrangian* scheme, the trajectories of actual physical parcels of fluid would be followed throughout the motion.

The problem with this approach, is that the distribution of representative parcels rapidly becomes *highly non-uniform*.

In the *semi-Lagrangian scheme* the individual parcels are followed only for a single time-step. After each step, we revert to a uniform grid.

The semi-Lagrangian algorithm has enabled us to integrate the primitive equations using a time step of 15 minutes. This can be compared to a typical timestep of 2.5 minutes for conventional schemes.

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The semi-Lagrangian method was pioneered by André Robert, the renowned Canadian meteorologist.

The first *operational implementation* of such a scheme was in 1982 at the Irish Meteorological Service.

Semi-Lagrangian advection schemes are now in widespread use in all the main Numerical Weather Prediction centres.

Eulerian and Lagrangian Approach

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This may be written in either of two alternative forms:

$$\begin{aligned} \frac{\partial Y}{\partial t} + c \frac{\partial Y}{\partial x} = 0 & \quad \Leftrightarrow \quad \text{Eulerian Form} \\ \frac{dY}{dt} = 0 & \quad \Leftrightarrow \quad \text{Lagrangian Form} \end{aligned}$$

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To develop numerical solution methods, we may start from *either* the Eulerian *or* the Lagrangian form of the equation.

For the semi-Lagrangian scheme, we choose the latter.

Since the advection equation is linear, we can construct a general solution from Fourier components

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This expression may be separated into the product of a function of space and a function of time:

$$Y = a \times \exp(-i\omega t) \times \exp(ikx); \quad \omega = kc.$$

Therefore, in analysing the properties of numerical schemes, we seek a solution of the form

$$Y_m^n = a \times \exp(-i\omega n \Delta t) \times \exp(ikm \Delta x) = a A^n \exp(ikm \Delta x)$$

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The character of the solution depends on the modulus of A :

If $|A| < 1$, the solution *decays* with time.

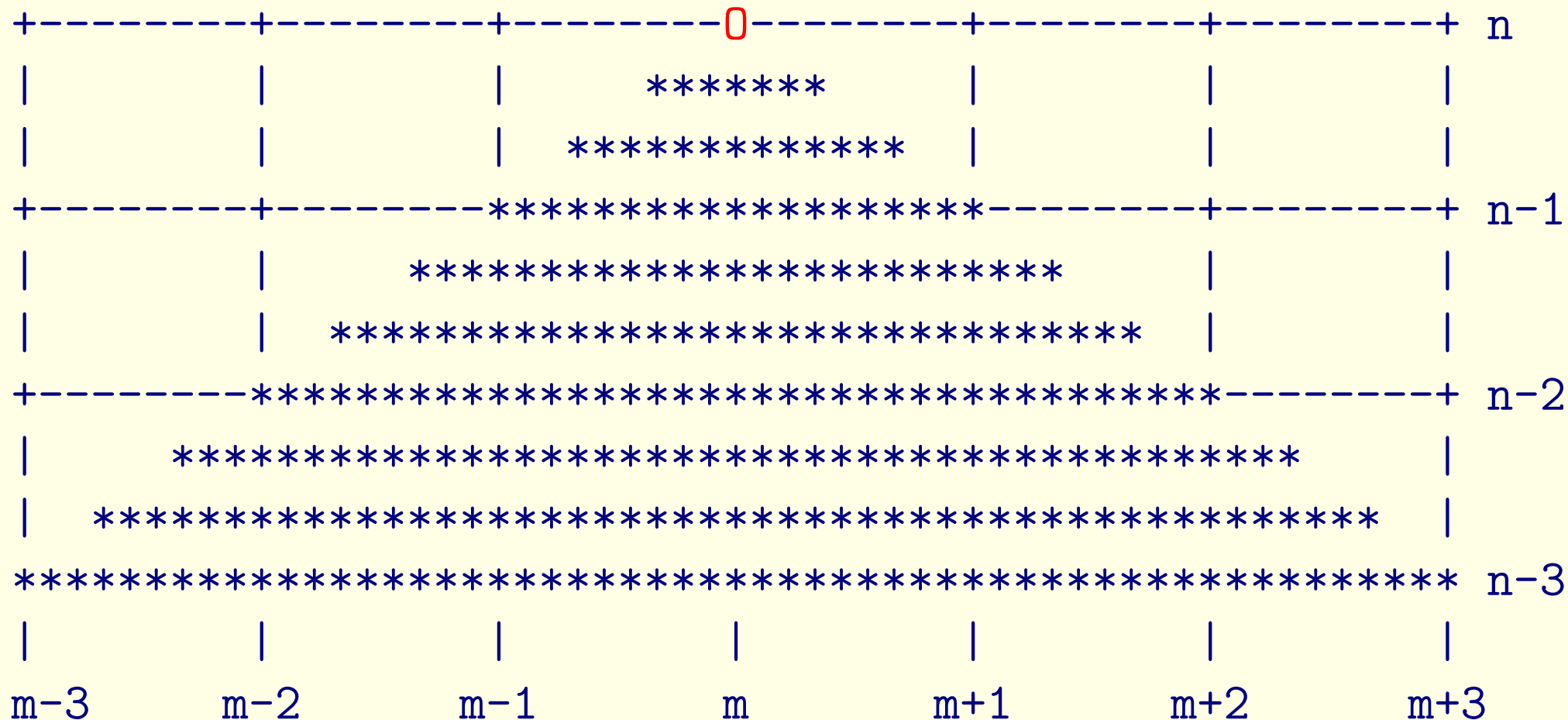
If $|A| = 1$, the solution is *neutral* with time.

If $|A| > 1$, the solution *grows* with time.

In the third case (growing solution), the scheme is *unstable*.

Numerical Domain of Dependence.

Space axis horizontal
Time axis vertical



For the **Eulerian Leapfrog Scheme**, the value Y_m^n at time $n\Delta t$ and position $m\Delta x$ depends on values within the area depicted by asterisks. Values outside this region have *no influence* on Y_m^n .

Numerical Domain of Dependence

Each computed value Y_m^n depends on previously computed values and on the initial conditions. The set of points which influence the value Y_m^n is called the *numerical domain of dependence* of Y_m^n .

It is clear on physical grounds that if the parcel of fluid arriving at point $m\Delta x$ at time $n\Delta t$ originates *outside the numerical domain of dependence*, the numerical scheme cannot yield an accurate result: the necessary information is not available to the scheme.

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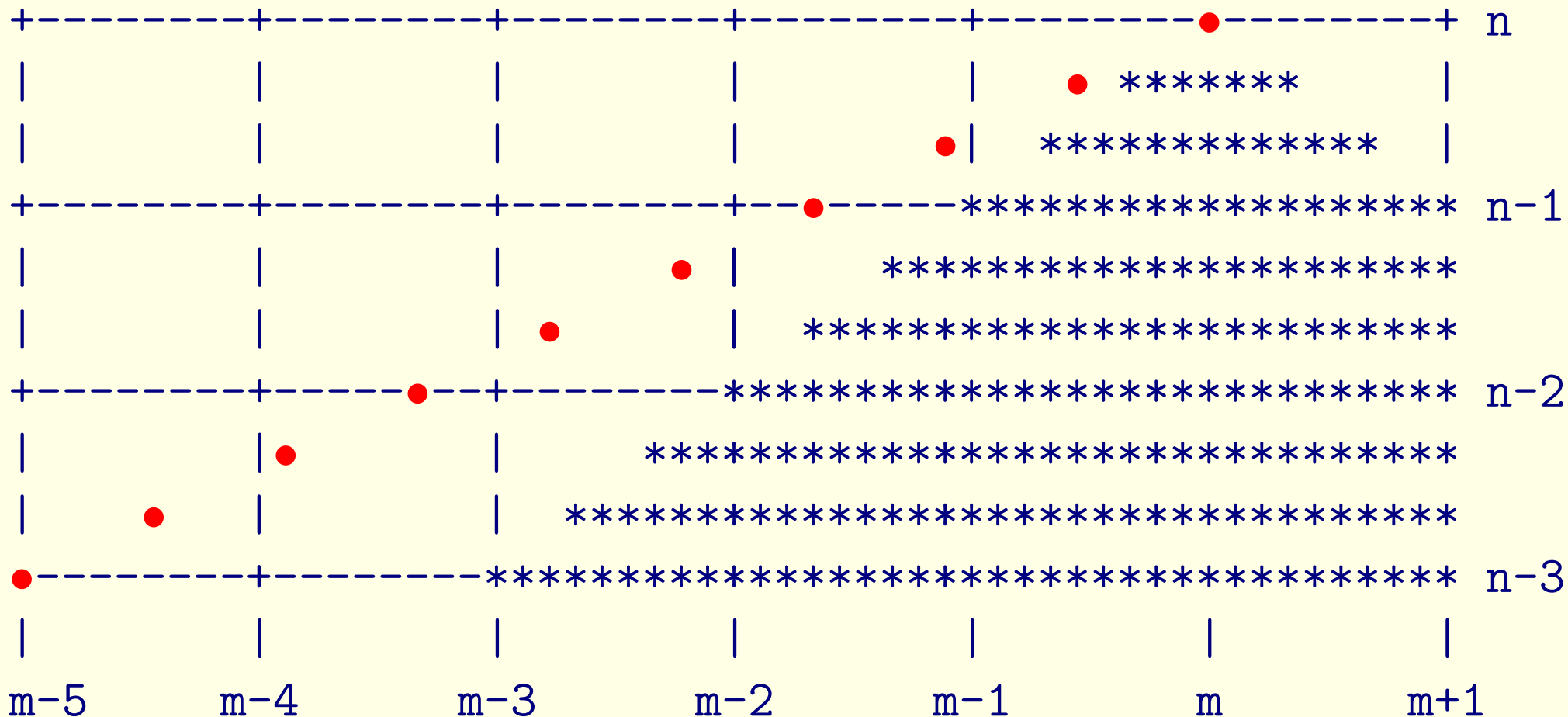
It is clear on physical grounds that if the parcel of fluid arriving at point $m\Delta x$ at time $n\Delta t$ originates *outside the numerical domain of dependence*, the numerical scheme cannot yield an accurate result: the necessary information is not available to the scheme.

Worse again, the numerical solution may bear absolutely no relationship to the physical solution and may grow exponentially with time even when the true solution is bounded.

A *necessary condition* for avoidance of this phenomenon is that the numerical domain of dependence should include the physical trajectory.

This condition is fulfilled by the semi-Lagrangian scheme.

Parcel coming from Outside Domain of Dependence



The line of bullets (●) represents a parcel trajectory.

The value everywhere on the trajectory is Y_m^n .

Since the parcel originates *outside* the numerical domain of dependence, **the Eulerian scheme *cannot* model it correctly.**

The central idea of the Lagrangian scheme is to *represent the physical trajectory of the fluid parcel*.

We consider a parcel *arriving* at gridpoint $m\Delta x$ at the new time $(n + 1)\Delta t$ and ask whence it has come.

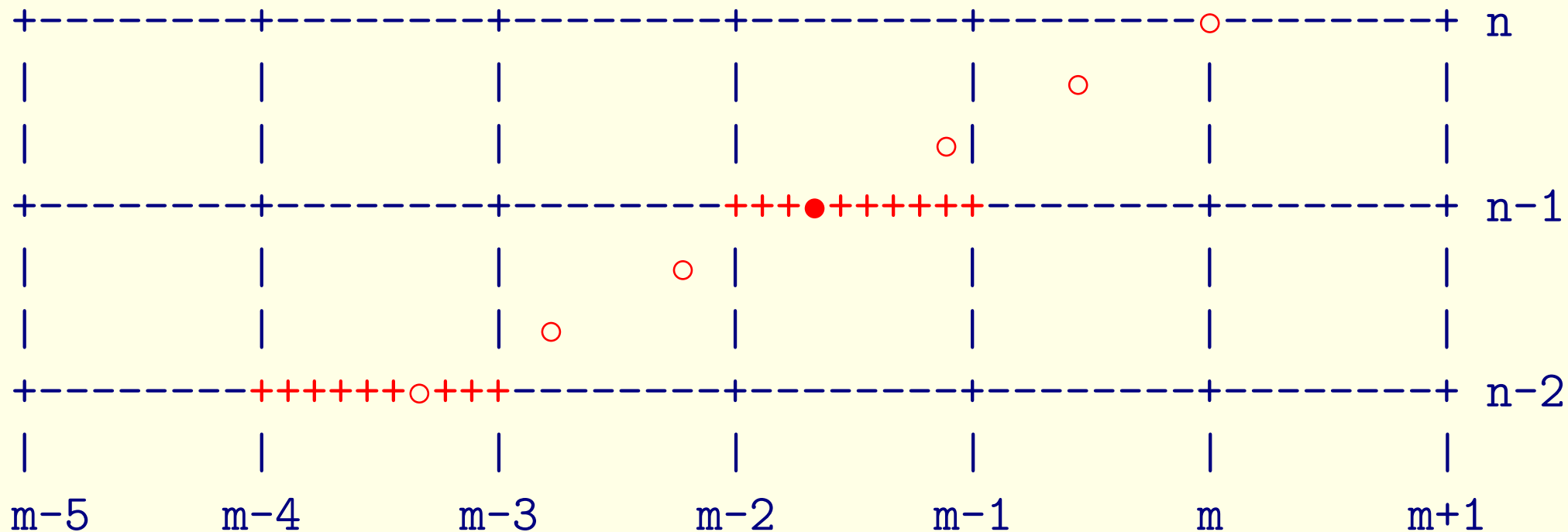
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We consider a parcel *arriving* at gridpoint $m\Delta x$ at the new time $(n + 1)\Delta t$ and ask whence it has come.

The *departure point* will not normally be a grid point. Therefore, the value at the departure point must be calculated by interpolation from *surrounding points*.

But this interpolation ensures that the trajectory falls within the numerical domain of dependence. We will show that this leads to a *numerically stable scheme*.

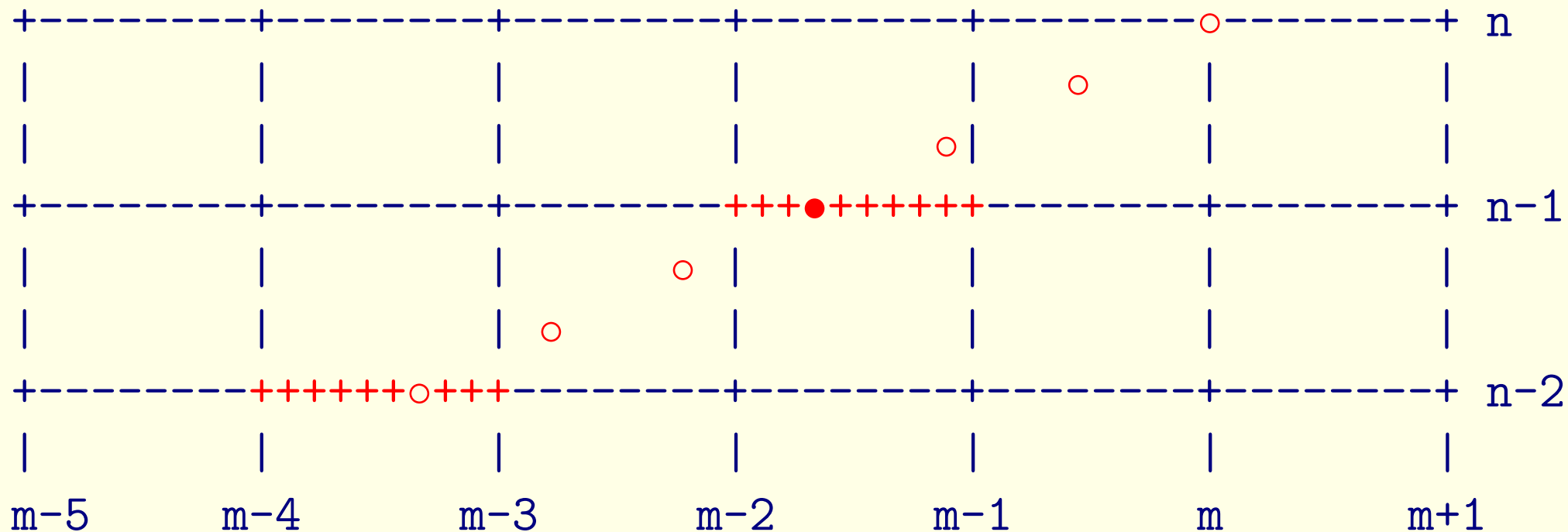
Interpolation using Surrounding Points



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Interpolation using Surrounding Points



The line of circles (\circ) represents a parcel trajectory.

At time $(n - 1)\Delta t$ the parcel is at (\bullet), which is not a grid-point.

The value at the **departure point** is obtained by interpolation from **surrounding points**.

Thus we ensure that the physical trajectory is *within* the domain of numerical dependence.

The advection equation in Lagrangian form may be written

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Applying the equation over the time interval $[n\Delta t, (n+1)\Delta t]$, we get

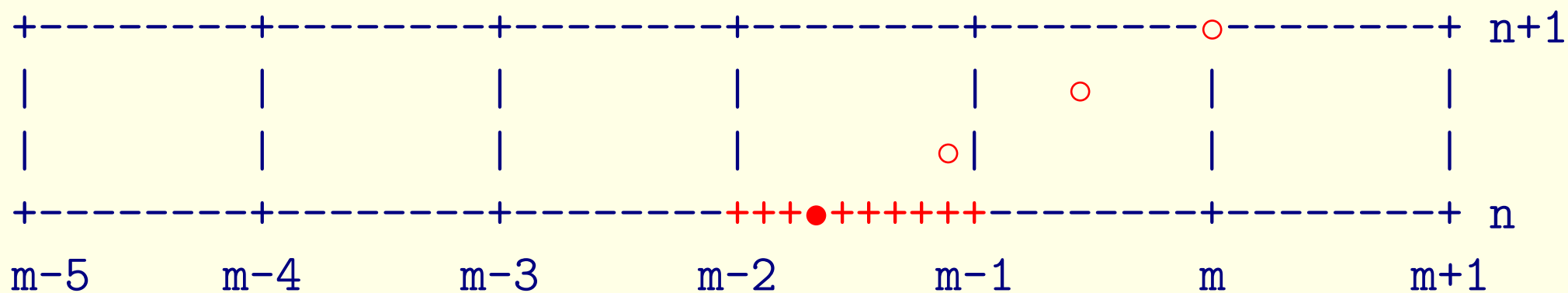
$$\left(\begin{array}{l} \text{Value of } Y \text{ at} \\ \text{point } m\Delta x \text{ at} \\ \text{time } (n+1)\Delta t \end{array} \right) = \left(\begin{array}{l} \text{Value of } Y \text{ at} \\ \text{departure point} \\ \text{at time } n\Delta t \end{array} \right)$$

or, in symbolic form,

$$Y_m^{n+1} = Y_{\bullet}^n$$

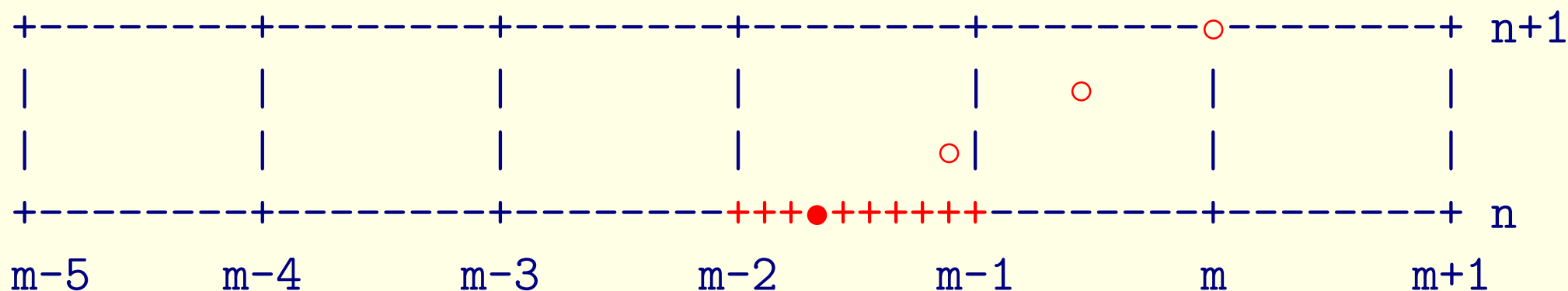
where Y_{\bullet}^n represents the value at the departure point, normally not a grid point.

Interpolation using Surrounding Points



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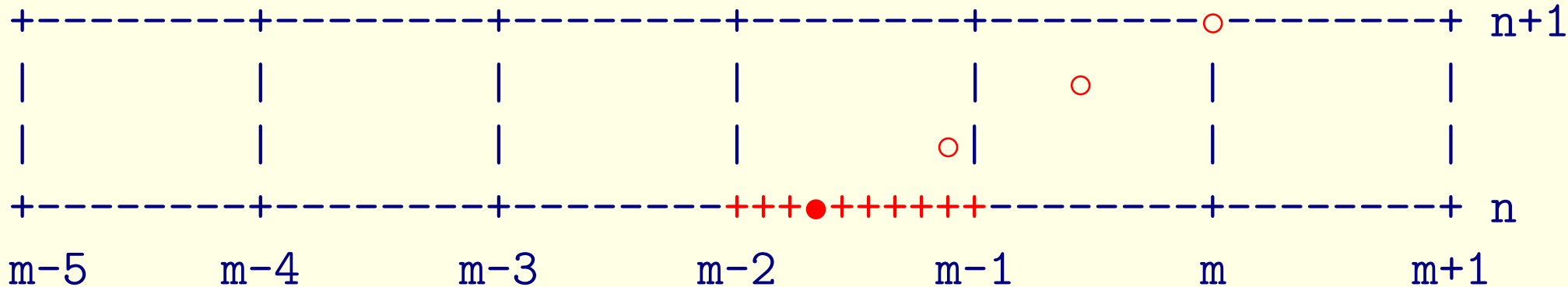
$$p = [s] = \text{Integral part of } s$$

$$\alpha = s - p = \text{Fractional part of } s$$

Note that, by definition, $0 \leq \alpha < 1$.

So, the departure point falls between the grid points $m-p-1$ and $m-p$. In the picture, $p = 1$ and $\alpha \approx 2/3$.

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A linear interpolation gives

$$Y_{\bullet}^n = \alpha Y_{m-p-1}^n + (1 - \alpha) Y_{m-p}^n.$$

Check: Verify that this gives sensible values in the limits $\alpha = 0$ and $\alpha = 1$.

Numerical Stability of the Scheme

The discrete equation may be written

$$Y_m^{n+1} = \alpha Y_{m-p-1}^n + (1 - \alpha) Y_{m-p}^n.$$

Let us look for a solution of the form

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Substituting into the equation we get

$$\begin{aligned} aA^{n+1} \exp(ikm\Delta x) &= \alpha aA^n \exp[ik(m-p-1)\Delta x] \\ &+ (1 - \alpha) aA^n \exp[ik(m-p)\Delta x] \end{aligned}$$

or, removing common terms,

$$A = \alpha \exp[ik(-p-1)\Delta x] + (1 - \alpha) \exp[ik(-p)\Delta x]$$

Again,

$$\begin{aligned} A &= \alpha \exp[ik(-p - 1)\Delta x] + (1 - \alpha) \exp[ik(-p)\Delta x] \\ &= \exp(-ikp\Delta x) \cdot [(1 - \alpha) + \alpha \exp(-ik\Delta x)] \end{aligned}$$

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Now consider the squared modulus of A :

$$\begin{aligned} |A|^2 &= |\exp(-ikp\Delta x)|^2 \cdot |(1-\alpha) + \alpha \exp(-ik\Delta x)|^2 \\ &= |(1-\alpha) + \alpha \cos k\Delta x - i\alpha \sin k\Delta x|^2 \\ &= [(1-\alpha) + \alpha \cos k\Delta x]^2 + [\sin k\Delta x]^2 \\ &= (1-\alpha)^2 + 2(1-\alpha)\alpha \cos k\Delta x + \alpha^2 \cos^2 k\Delta x + \alpha^2 \sin^2 k\Delta x \\ &= 1 - 2\alpha(1-\alpha)[1 - \cos k\Delta x]. \end{aligned}$$

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We note that $0 \leq (1 - \cos \theta) \leq 2$. Taking the largest value of $1 - \cos k\Delta x$ gives

$$|A|^2 = 1 - 4\alpha(1-\alpha) = (1-2\alpha)^2 < 1.$$

Taking the smallest value of $1 - \cos k\Delta x$ gives

$$|A|^2 = 1.$$

In either case, $|A|^2 \leq 1$, so *there is numerical stability.*

Discussion and Conclusion

- *We have determined the departure point by **interpolation**.*
- *This ensures that $0 \leq \alpha < 1$.*
- *This in turn ensures that $|A| \leq 1$.*
- *In other words, we have **unconditional numerical stability**.*
- *The implication is that **the time step is unlimited**.*

- In contradistinction to the Eulerian scheme *there is no CFL criterion*.
- Of course, we must consider *accuracy* as well as *stability*
- The time step Δt is chosen to ensure *sufficient accuracy*, but can be much larger than for an Eulerian scheme.
- Typically, Δt is about *six times larger* for a semi-Lagrangian scheme than for an Eulerian scheme.
- This is a *substantial gain* in computational efficiency.

