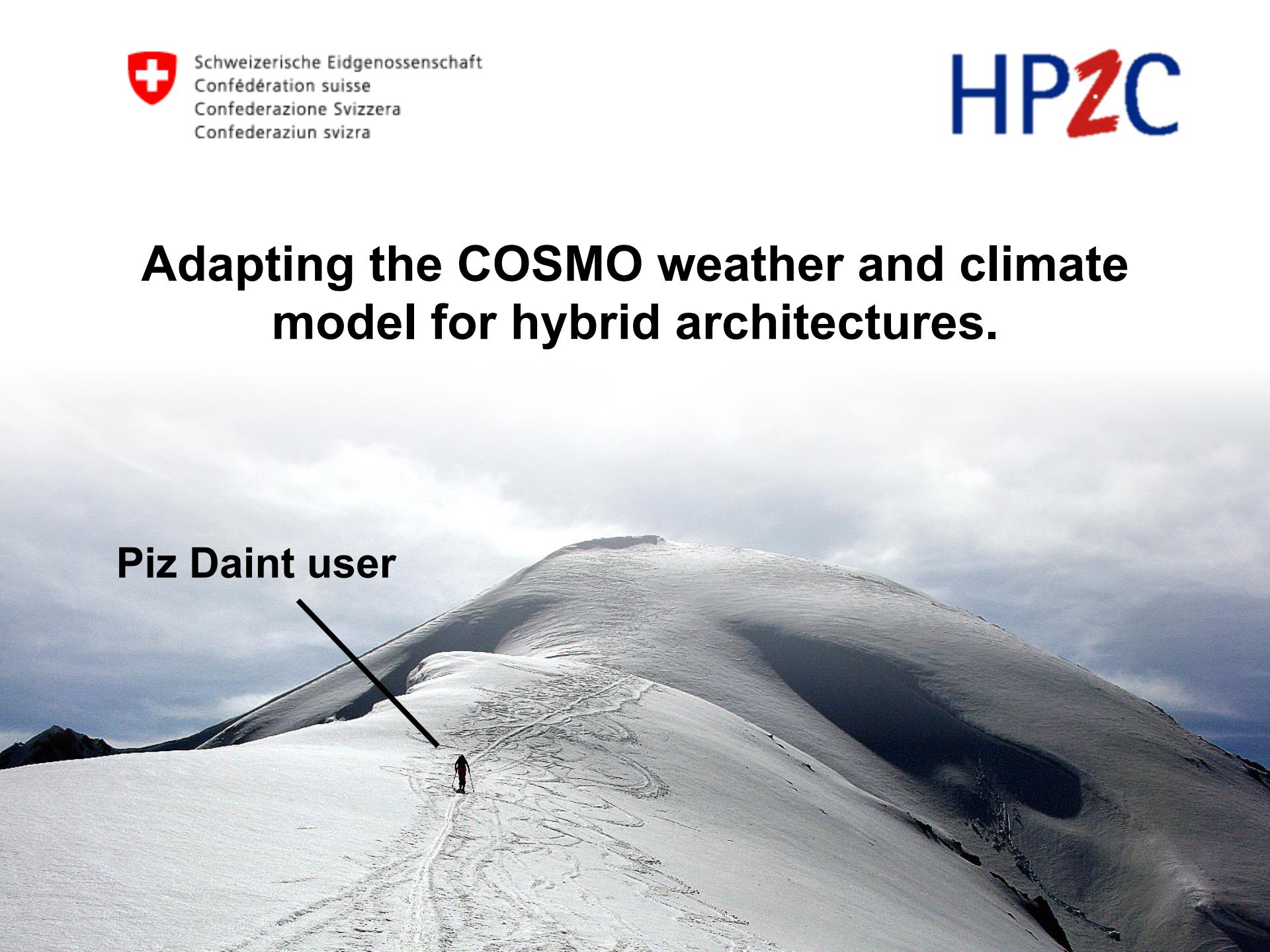




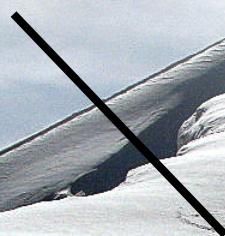
Schweizerische Eidgenossenschaft  
Confédération suisse  
Confederazione Svizzera  
Confederaziun svizra

HPZC

# Adapting the COSMO weather and climate model for hybrid architectures.



Piz Daint user





# Overview

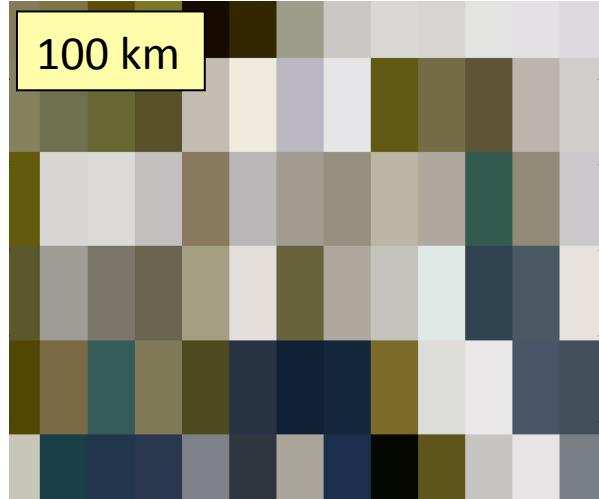
- Weather and climate modeling
- COSMO model
- Porting approaches
- Performance results
- Discussion



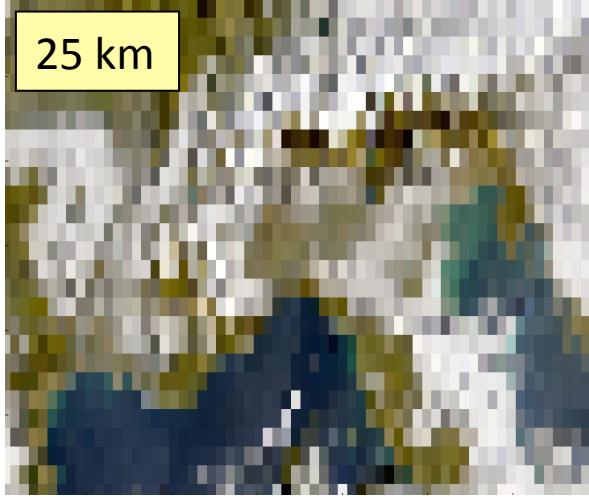
**Why do weather and climate simulations require increasing amount of HPC resources?**



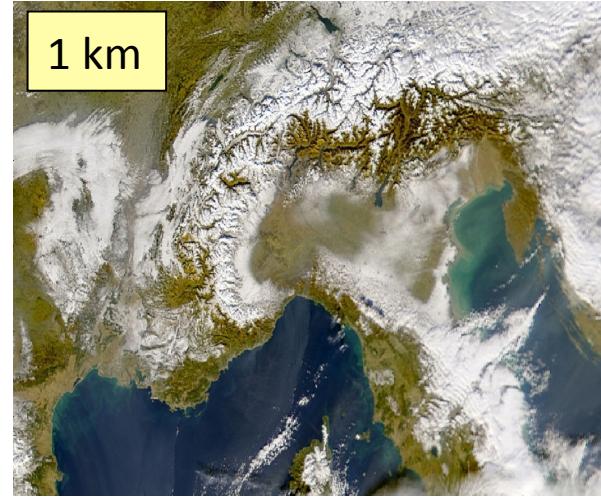
# Higher resolution



Global climate model



Global weather model



Regional weather model

**Resolution is of key importance to reduce the uncertainty  
of weather and climate model predictions**

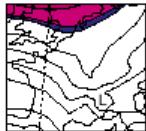
(e.g. regional weather, extreme events, underlying processes)

**2 x horizontal resolution  $\approx$  8 x computational cost**

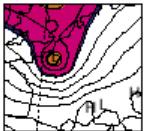


# Single forecast (T+42h)

Deterministic prediction



Verification



Ensemble forecast of the French / German storms (surface pressure)  
Start date 24 December 1999 : Forecast time T+42 hours



8



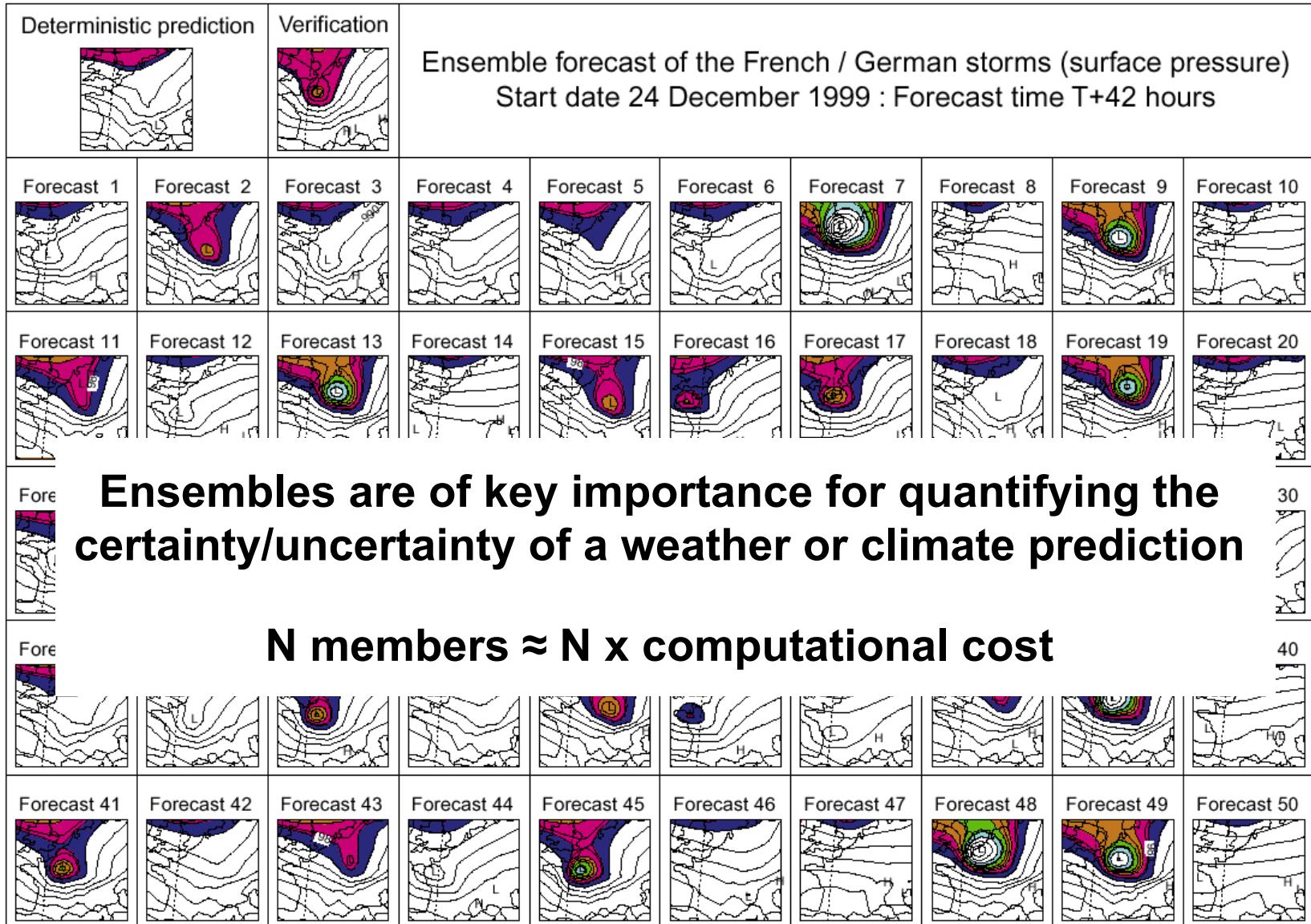
9

**“The overall loss in Europe as a whole came to €6bn, making Lothar the largest loss ever to be carried by the insurance industry following a European windstorm event.” (Munich Re, 2002)**



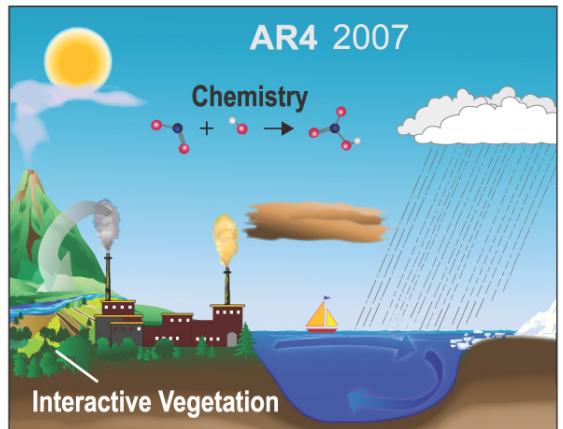
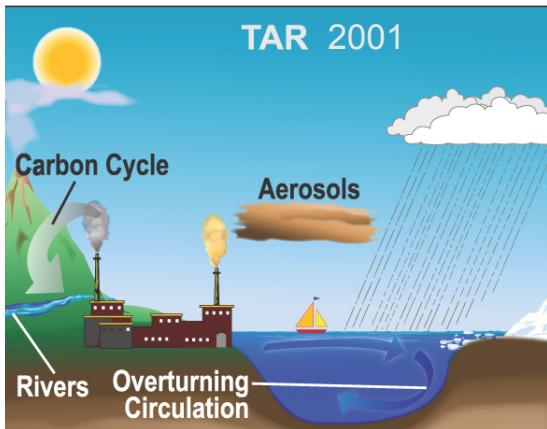
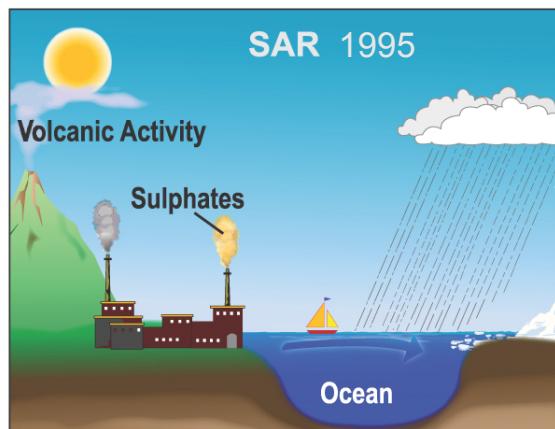
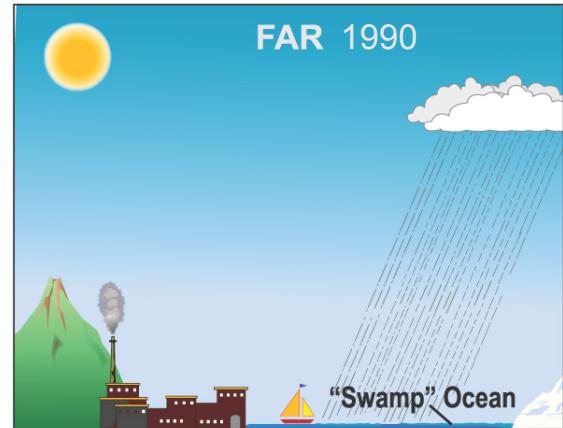
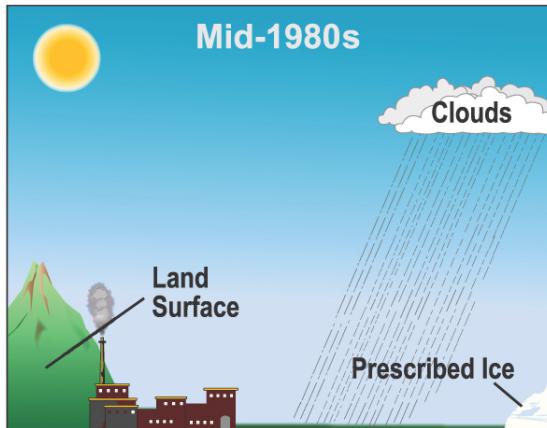
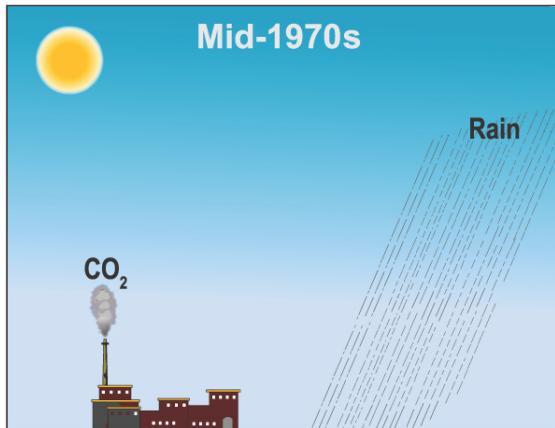


# Ensemble forecast (T+42h)





# Model complexity

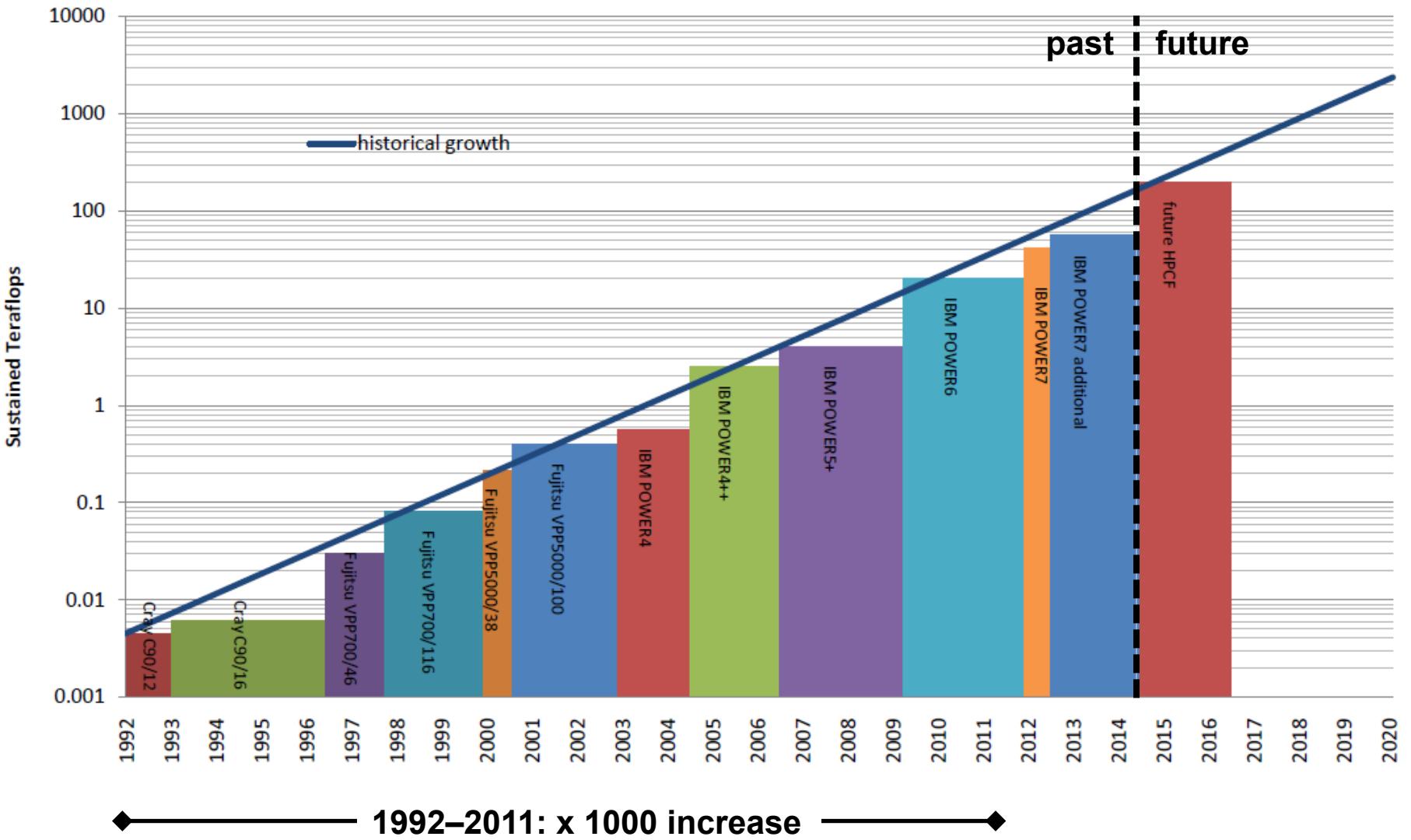




**What is the benefit of increasing HPC resources  
for weather and climate simulation?**



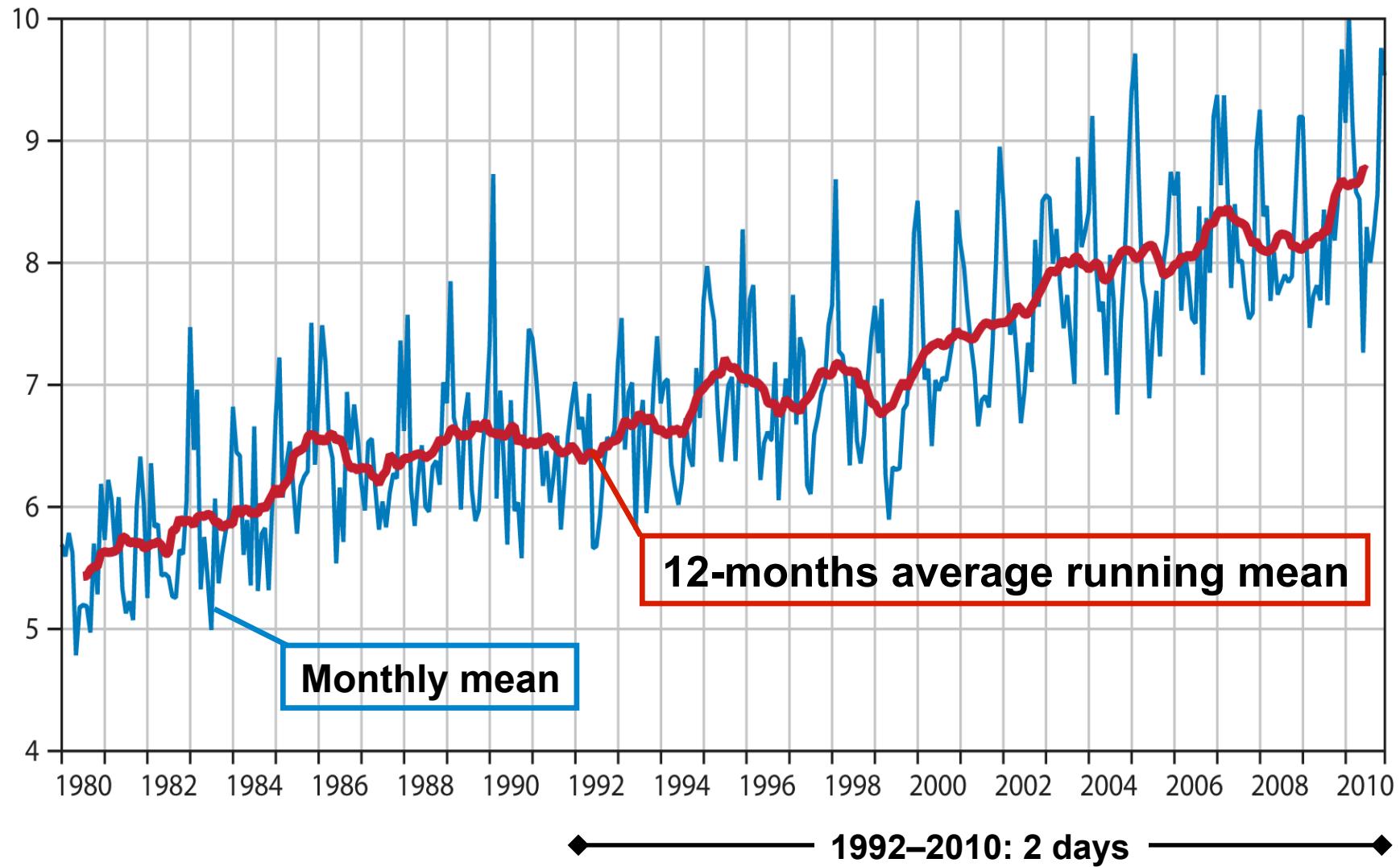
# ECWMF sustained performance





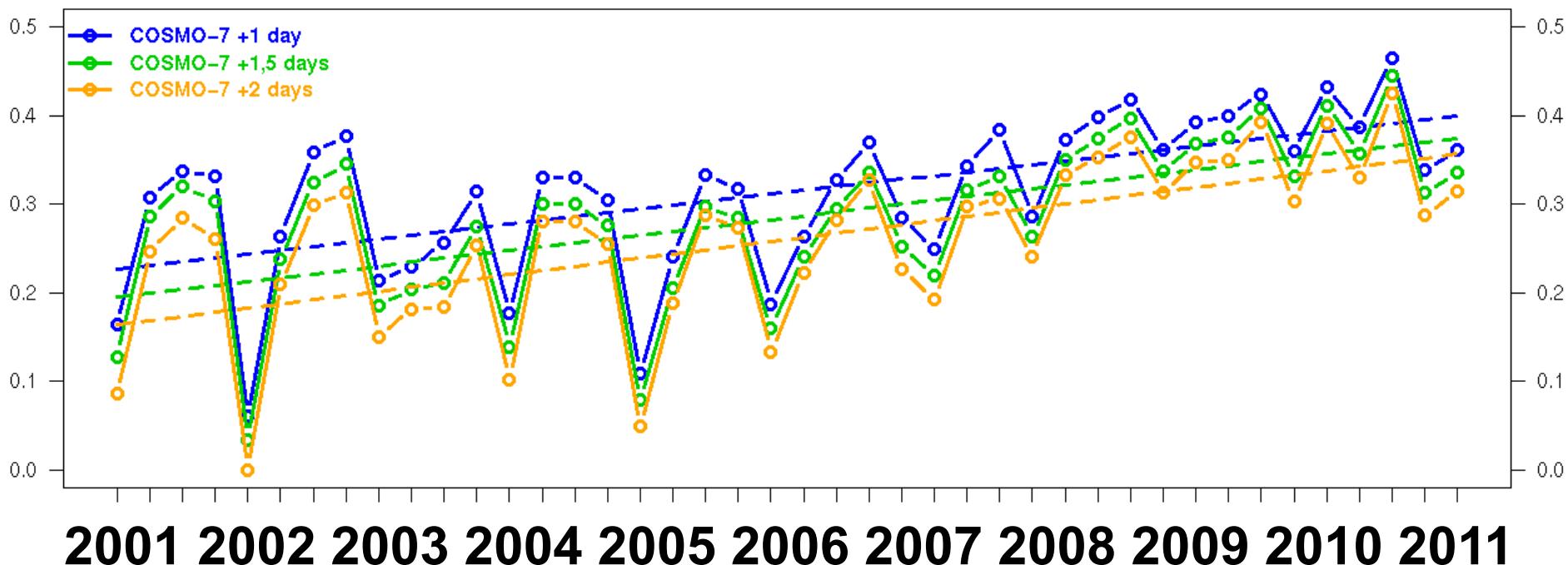
# Long-term evolution of global forecast

## IFS, ACC 500hPa reaches 60%





# Long-term evolution of regional forecast (Temperature, seasonal verification)

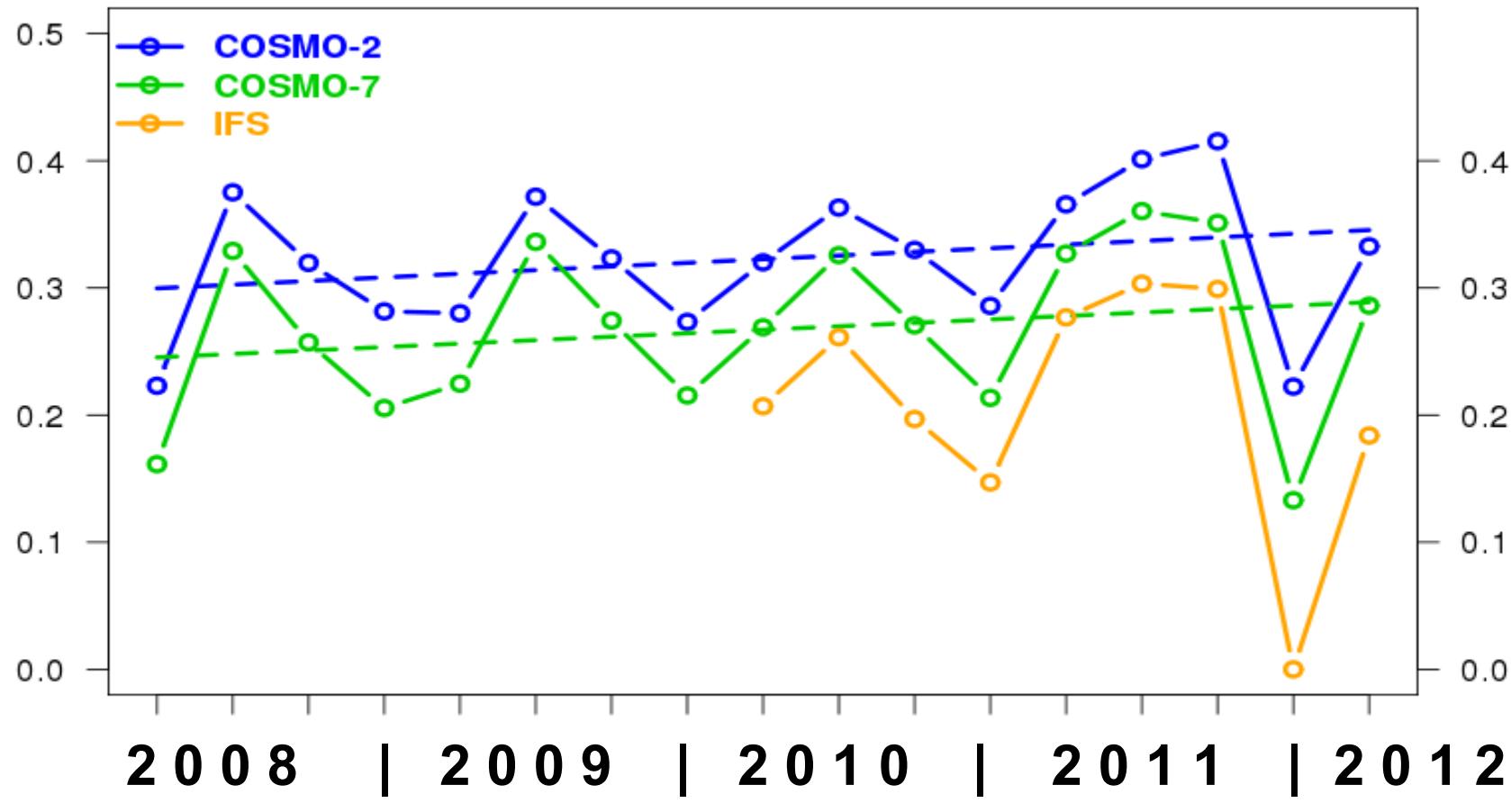


**Verification against observations over Europe**  
0 = lowest score / 1 = perfect forecast



# Benefit of regional models

## (Wind, comparison IFS / COSMO-7 / COSMO-2)



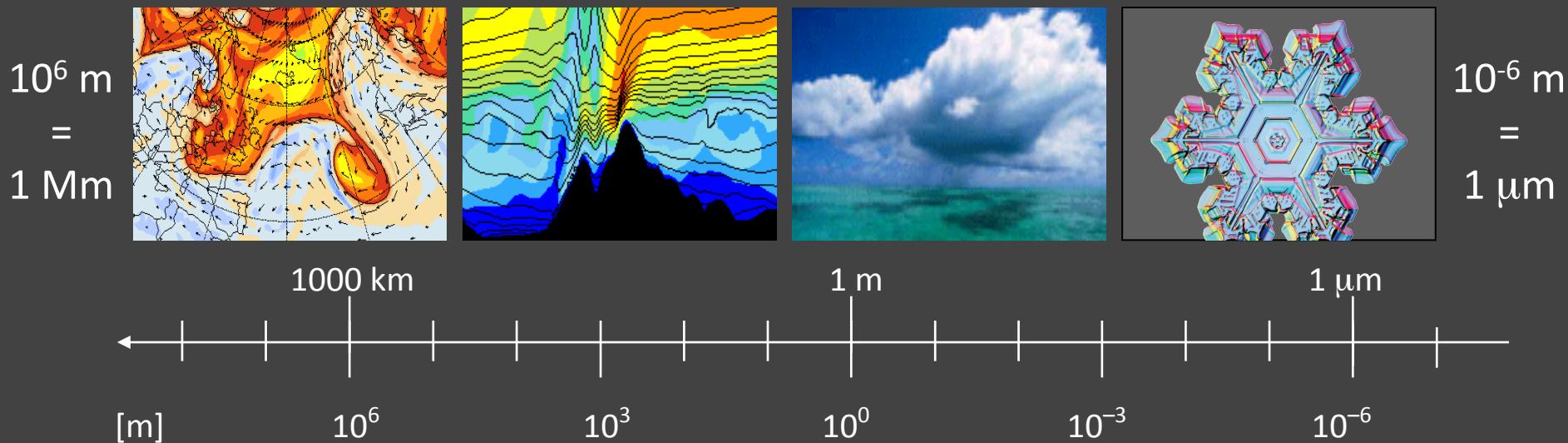
Verification against observations over Switzerland

0 = lowest possible score / 1 = perfect forecast



# **Regional weather and climate modeling using the COSMO model**

# The weather and climate system (multi-scale, multi-physics)

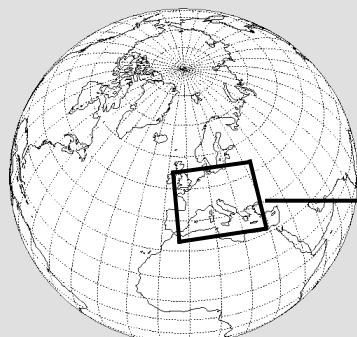




# The modeling chain

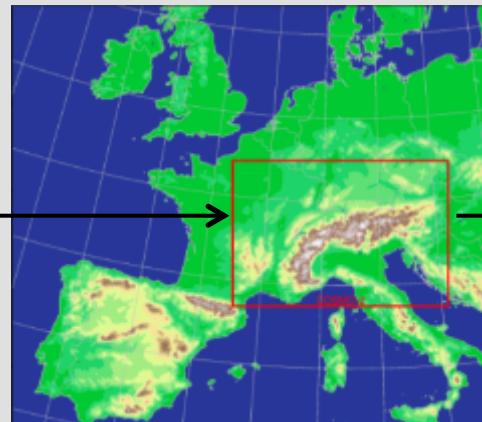
## ECMWF-Model

$dx = 16 \text{ km}$   
2 x per day  
10 day forecast



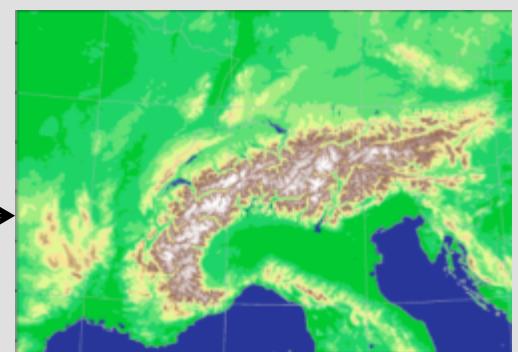
## COSMO-7

$dx = 6.6 \text{ km}$   
3 x per day  
3 day forecast



## COSMO-2

$dx = 2.2 \text{ km}$   
8 x per day  
33 h forecast





# COSMO Model

## (COncsortium for Small-scale MOdelling)



### Germany

Deutscher Wetterdienst (DWD)



### Switzerland

MeteoSwiss



### Italy

Ufficio Generale Spazio Aereo e Meteorologia (USAM)



### Greece

Hellenic National Meteorological Service (HNMS)



### Poland

Institute for Meteorology and Water Management (IMGW)



### Romania

National Meteorological Administration (NMA)



### Russia

Federal Service for Hydrometeorology and Environmental Monitoring (Roshydromet)



...used at over 70 universities

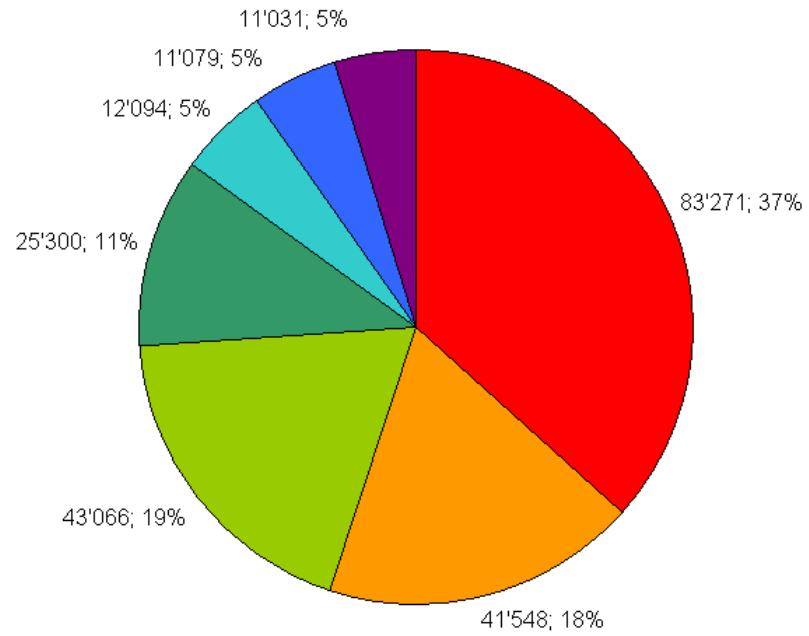


# Current trunk version

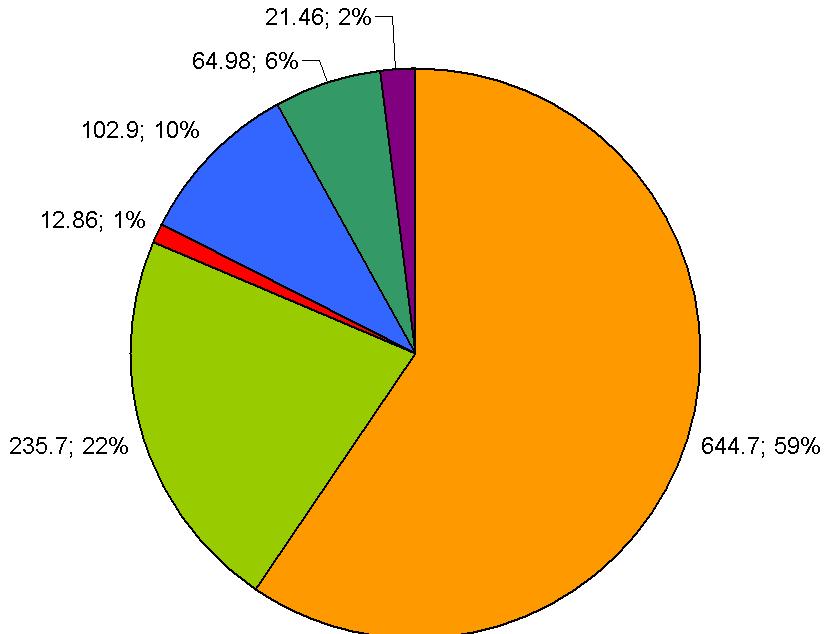
- Monolithic
- 250'000 lines of Fortran 90 code



## % LOC



## % Runtime





# Dynamics

**wind**

$$\rho \frac{d\mathbf{v}}{dt} = -\nabla p + \rho \mathbf{g} - 2\boldsymbol{\Omega} \times (\rho \mathbf{v}) - \nabla \cdot (\underline{\mathbf{T}})$$

**pressure**

$$\frac{dp}{dt} = -(c_{pd}/c_{vd})p\nabla \cdot \mathbf{v} + (c_{pd}/c_{vd} - 1)Q_h$$

**temperature**

$$\rho c_{pd} \frac{dT}{dt} = \frac{dp}{dt} + Q_h$$

**water**

$$\rho \frac{dq^v}{dt} = -\nabla \cdot \mathbf{F}^v - (I^l + I^f)$$

$$\rho \frac{dq^{l,f}}{dt} = -\nabla \cdot (\mathbf{P}^{l,f} + \mathbf{F}^{l,f}) + I^{l,f}$$

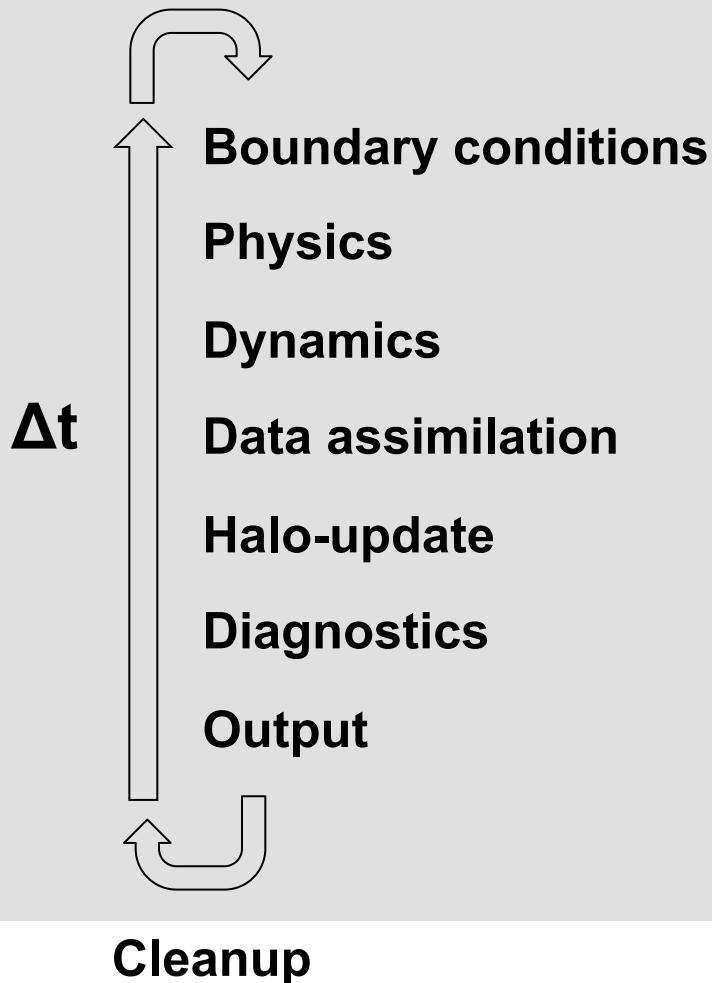
**density**

$$\rho = p\{R_d(1 + (R_v/R_d - 1)q^v - q^l - q^f)T\}^{-1}$$



# COSMO Workflow

## Initialization



## Properties

- Sequential workflow
- PDEs
- Structured grid
- Finite differences
- Low compute intensity
- Compact stencils



## **How to adapt COSMO for current and future hybrid architectures?**



# Challenges

- **Timescales**
  - Model: ~ 10 years + 20 years
  - Hardware: ~ 4 years
- **Effort and Complexity**
  - > 250'000 LOC
  - Heterogeneous collection of modules
  - Moving target
- **Community code**
  - Single source
  - Performance portability
  - Maintainability
  - Usability



# Acceleration with GPUs for COSMO?

- CPUs and accelerators have separate memories
- Transfer of data on each timestep too expensive

* Part	Time/ $\Delta t$
Dynamics	<b>166 ms</b>
Physics	<b>56 ms</b>
Total	<b>253 ms</b>

vs

§ Transfer of all prognostic variables  
**68 ms**

All code which touches the prognostic variables on every timestep has to be ported



# Porting approach

- **Dynamics**
    - 40k lines, 60% runtime
    - Few developers
    - Performance critical
    - Stencils
  - **Rest of code (physics, assimilation, ...)**
    - 130k lines, 25% runtime
    - Several developers
    - “Plug-in” from other models
    - Only partly performance critical
    - Point-wise or column-based
- 
- Rewrite**
- full port
  - DSL
- Fortran + MPI + “X”**
- keep source
  - partial port
  - directives



# The Fortran + MPI + “X” Approach



**“I want you to find a bold and innovative way to do  
everything exactly the same way it’s been done for 25 years.”**



# OpenACC porting

## Strategy

- Parallelization in horizontal (1 thread per column)
- All data resident on GPU
- Avoid data creation as much as possible
- Restructure/optimize time-critical parts
- Use > 1 compiler

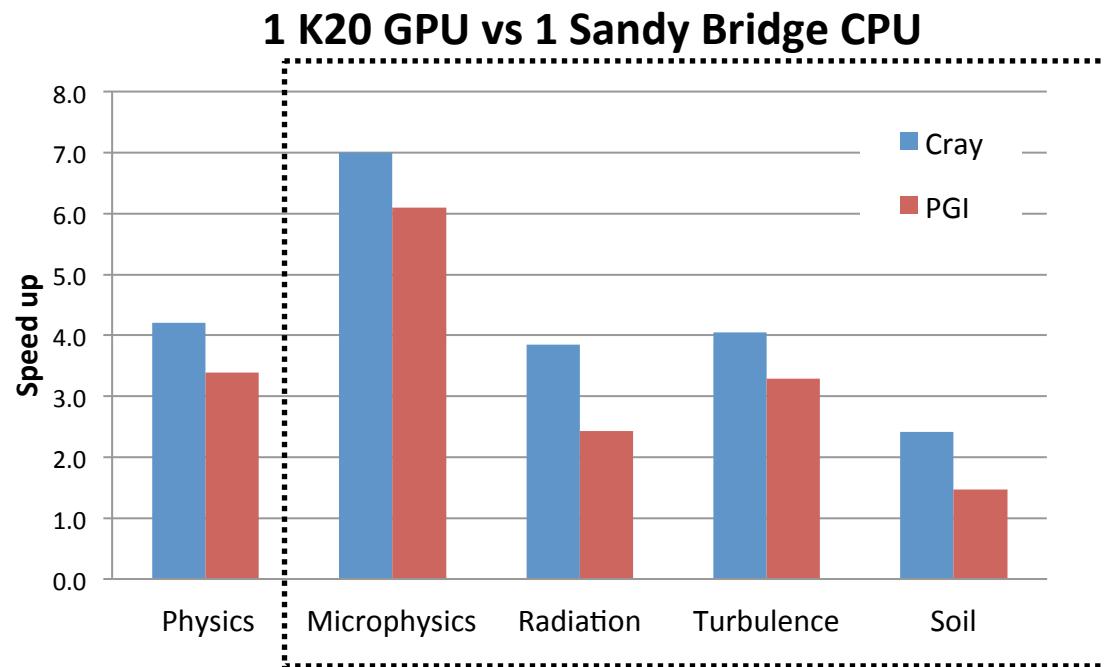
## Effort

- 60k lines required porting
- 3600 directives



# Performance results (Physics)

- Test domain: 263x92x60, 1h simulation.
- Socket to Socket comparison



- Varying optimization effort
- Overall speedup between 3x and 4x (no data transfer)



# Fortran + MPI + OpenACC Approach

## Pros

- Good performance possible
- Retain original language
- Incremental porting possible
- “Rapid” porting of non time-critical parts
- Very good interaction with compiler builders
- Accessible to non-expert programmers

## Cons

- No free lunch!
- Data management is hard
- Single source not always possible
- Performance portability
- Different compiler behavior
- Implementations maturing



# Rewrite of dynamics

## Strategy

- Code analysis and performance model
- Build re-usable software components

## Effort

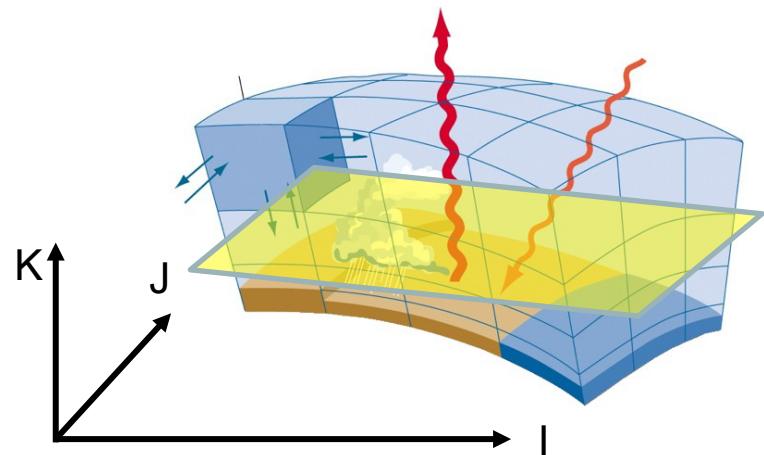
- 40k lines rewritten



# Dynamics: Algorithmic motifs

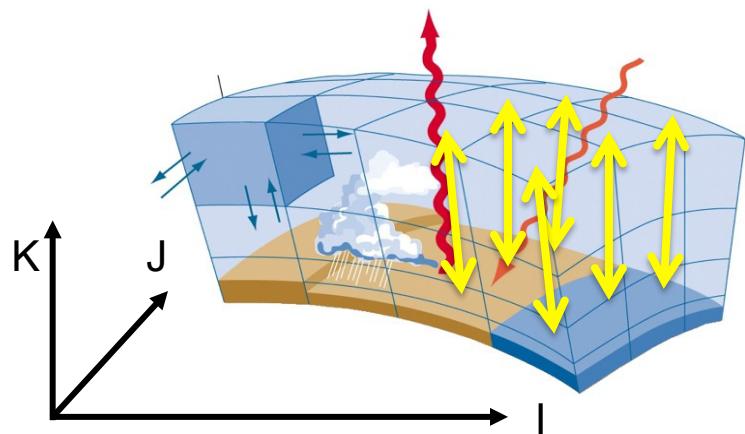
## 1. Finite difference stencil computations

- Focus on horizontal IJ-plane accesses
- No loop carried dependencies



## 2. Tri-diagonal solves

- vertical K-direction stencils
- Loop carried dependencies in K





# Dynamics: Learnings

- **Fortran code is a mix** of mathematical model, numerical discretization, solution algorithm, and hardware dependent implementation details
- Strongly **memory bandwidth bound**
- Optimizations are **hardware dependent** and **increase code complexity**
- Consequences
  - Hard to achieve performance portability with a single source code!
  - Hard to understand, modify and debug
  - Hard to re-use
  - Hard to attract good programmers



# Solutions?

- Good compromise (if it exists!)
- Several efficient source codes
- Separate model and algorithm from hardware specific implementation and optimization using a DSL





# DSL Approach

- Domain-specific language (DSL)  
A language that exploits domain knowledge for both **productivity** and **efficiency** at the cost of **generality**
- Several flavors
  - Source-to-source translation (Liszt, ATMOL, ICON, PATUS, ...)
  - embedded in host language (STELLA, Physis, ...)
  - compiler extension (Halide, Pochoir, ...)
- **STELLA** (Stencil Loop Language) is a DSL for solving PDEs on structured grids
  - embedded in C++ using template meta-programming



# Example: Laplacian

- Operator has two main components
  - Loop-logic defining the stencil application domain and order
  - Stencil defining the operator to be applied

```
do k = kstart, kend
    do j = jstart, jend
        do i = istart, iend
            lap(i, j, k) = -4.0_ir * data(i, j, k) +  &
                data(i+1, j , k) + data(i-1, j , k) +  &
                data(i , j+1, k) + data(i , j-1, k)
        end do
    end do
end do
```



# STELLA (user code)

```
enum { data, lap } ;

template<typename TEnv>
struct Laplace
{
    STENCIL_STAGE(Tenv)
    STAGE_PARAMETER(FullDomain, data)
    STAGE_PARAMETER(FullDomain, lap)

    static void Do()
    {
        lap::Center() =
            -4.0 * data::Center() +
            data::At(iplus1) +
            data::At(iminus1) +
            data::At(jplus1) +
            data::At(jminus1);
    }
};
```

```
IJKRealField lapfield, datafield;
Stencil stencil;

StencilCompiler::Build(
    pack_parameters(
        Param<lap, cInOut>(lapfield),
        Param<data, cIn>(datafield)
    ),
    concatenate_sweeps(
        define_sweep<KLoopFullDomain>(
            define_stages(
                StencilStage<Laplace, IJRangeComplete>()
            )
        )
    )
);

stencil.Apply();
```



# STELLA (user code)

## Stencil

```
enum { data, lap } ;  
  
template<typename TEnv>  
struct Laplace  
{  
    STENCIL_STAGE(Tenv)  
    STAGE_PARAMETER(FullDomain, data)  
    STAGE_PARAMETER(FullDomain, lap)  
  
    static void Do()  
    {  
        lap::Center() =  
            -4.0 * data::Center() +  
            data::At(iplus1) +  
            data::At(iminus1) +  
            data::At(jplus1) +  
            data::At(jminus1);  
    }  
};
```

## Loop-logic

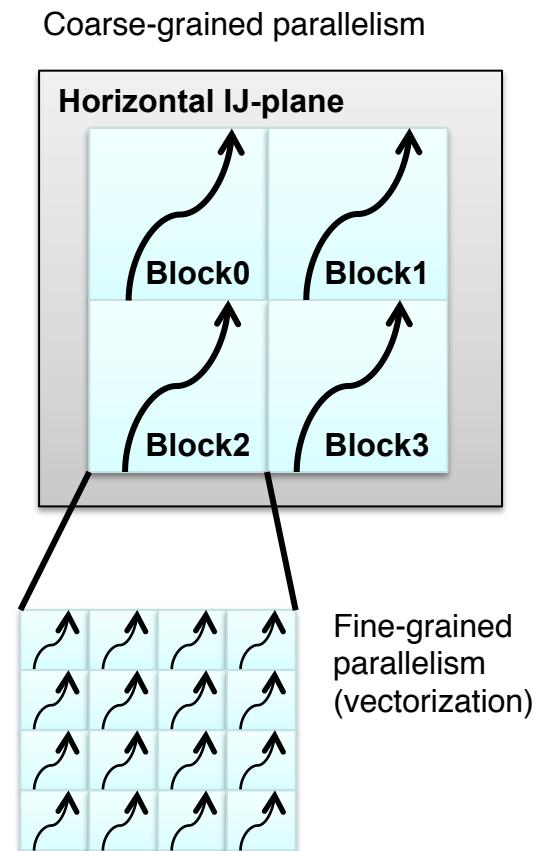
```
IJKRealField lapfield, datafield;  
Stencil stencil;  
  
StencilCompiler::Build(  
    pack_parameters(  
        Param<lap, cInOut>(lapfield),  
        Param<data, cIn>(datafield)  
    ),  
    concatenate_sweeps(  
        define_sweep<KLoopFullDomain>(  
            define_stages(  
                StencilStage<Laplace, IJRangeComplete>()  
            )  
        )  
    )  
);  
  
stencil.Apply();
```



# STELLA backends

A single switch chooses the STELLA backend

- The same high-level user code can be compiled using different backends
- **CPU (x86 multi-core)**
  - kij-storage
  - ij-blocking
  - Coarse: OpenMP threads
  - Fine: vectorization by compiler
- **GPU (NVIDIA)**
  - ijk-storage
  - Coarse: CUDA thread blocks
  - Fine: CUDA threads
  - software managed caching





# DSL Approach

## Pros

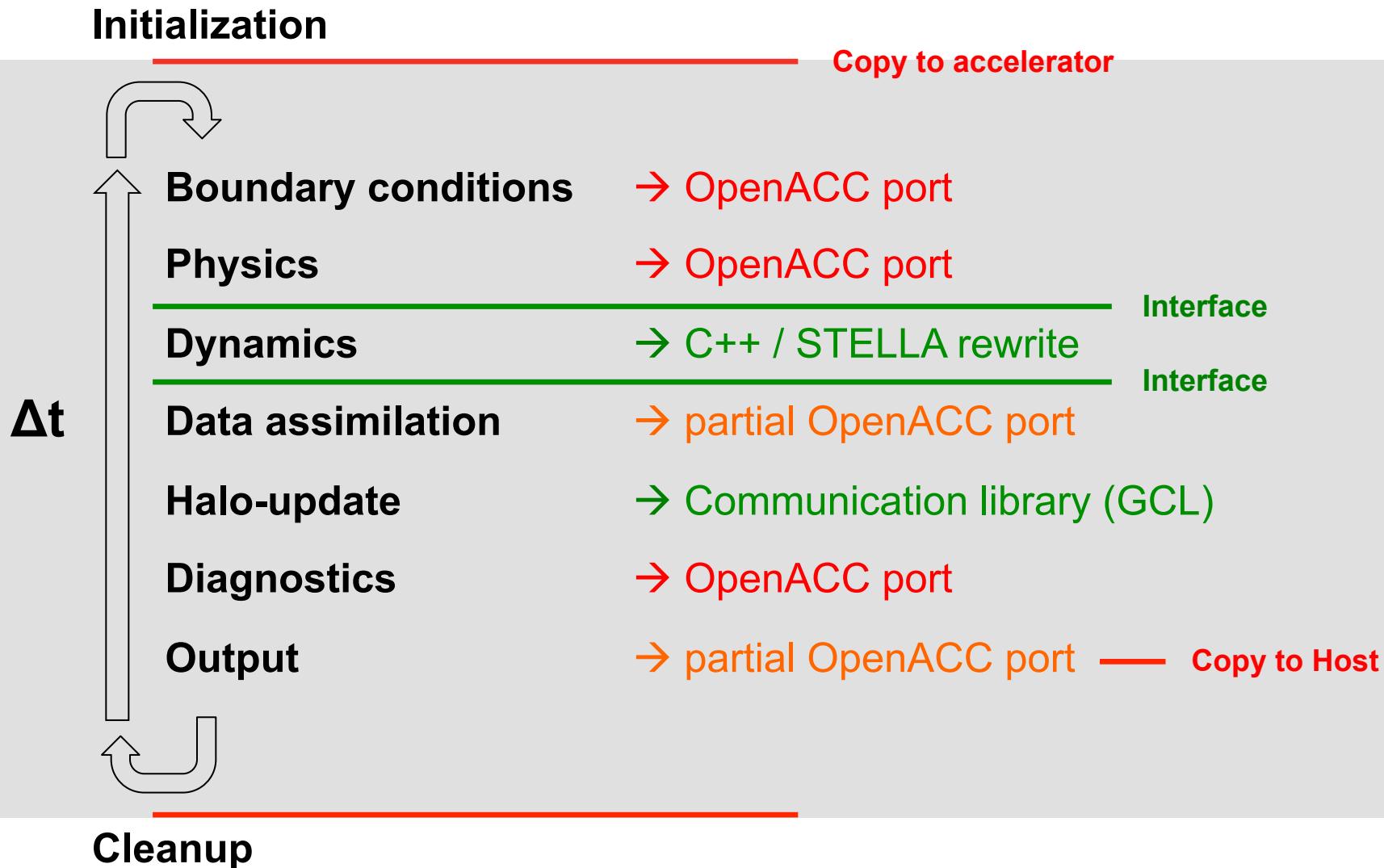
- Performance portability
- Separation of concerns (algorithm / implementation strategy)
- Single user code
- DSL enforces coding conventions
- Accessible to non-expert programmers

## Cons

- Paradigm shift
- Maintenance of DSL library
- Backends require expert knowledge
- Fixed set of features
- Loss of abstraction painful



# Integration





# Integration and Testing

- **Interoperability** of key importance
  - Fortran & C++
  - OpenACC & CUDA
  - Middleware (STELLA, GCL) & legacy code
  - Compiler 1 & Compiler 2
- **Bit-reproducibility** useful
  - different data distributions
  - different hardware architectures

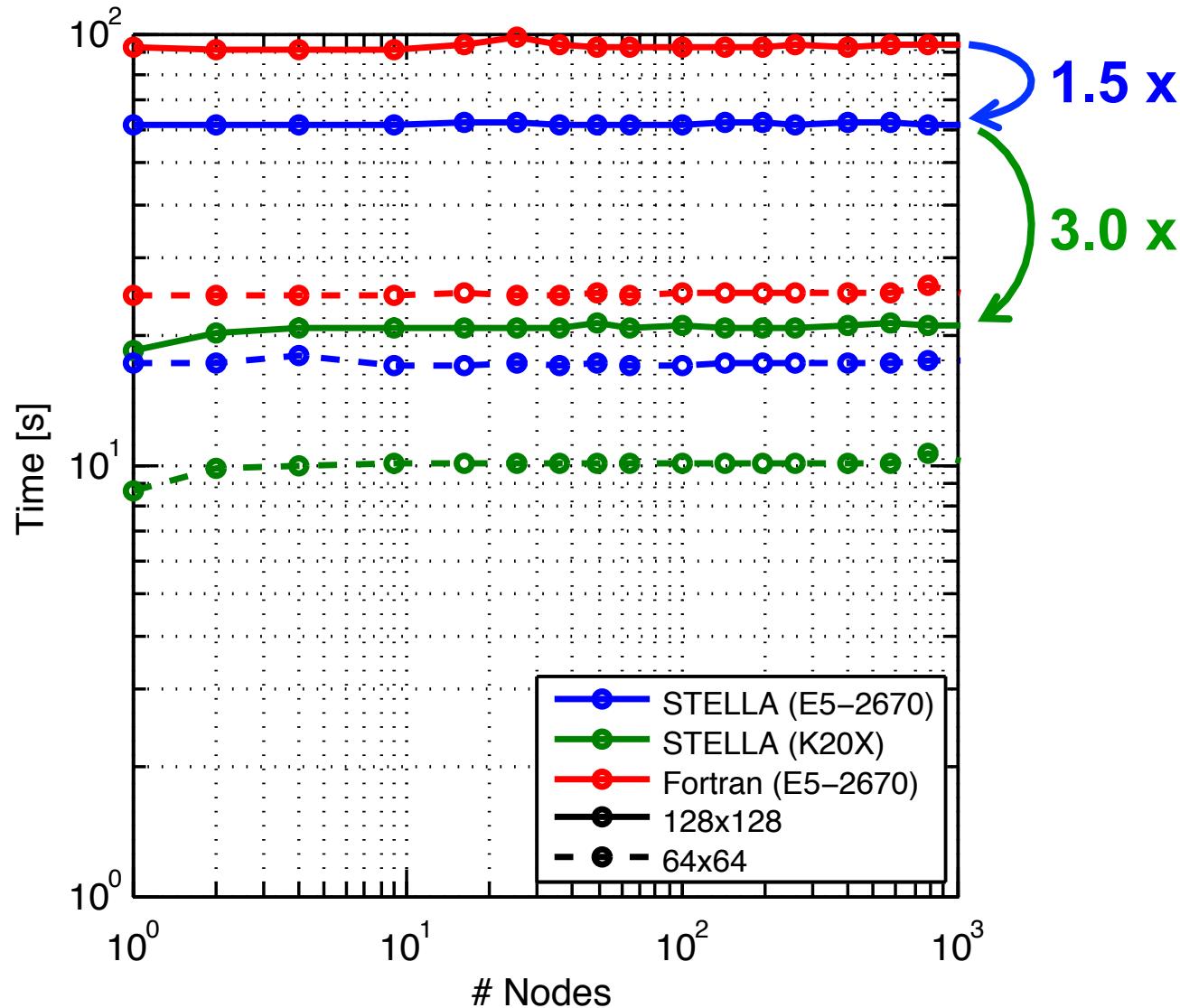


## **Performance results on Piz Daint**



# Weak scaling (Piz Daint, no I/O)

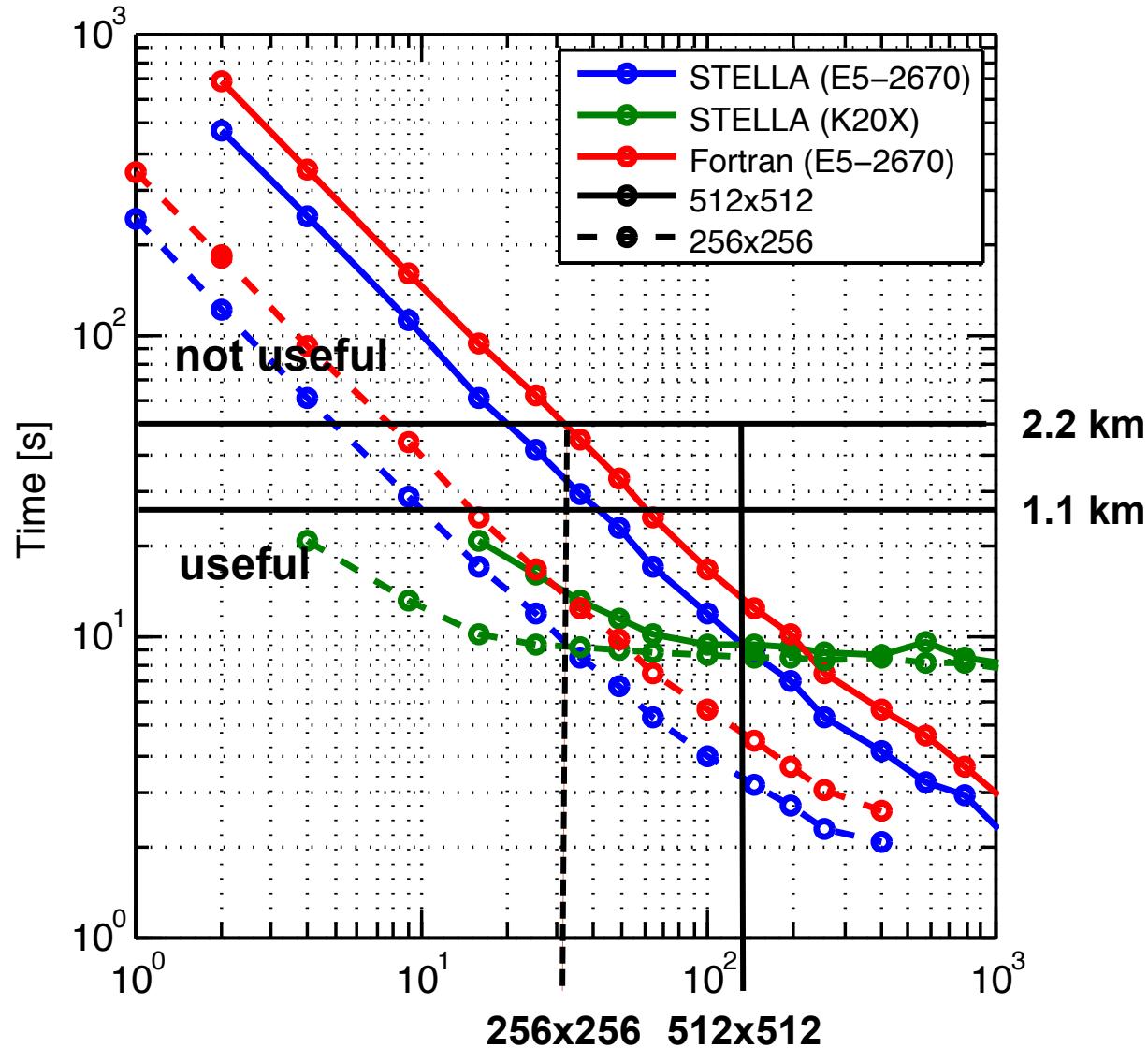
Gridpoints per node: 128x128x60 or 64x64x60)





# Strong scaling (Piz Daint, no I/O)

Total number of gridpoints: 512x512x60 or 256x256x60





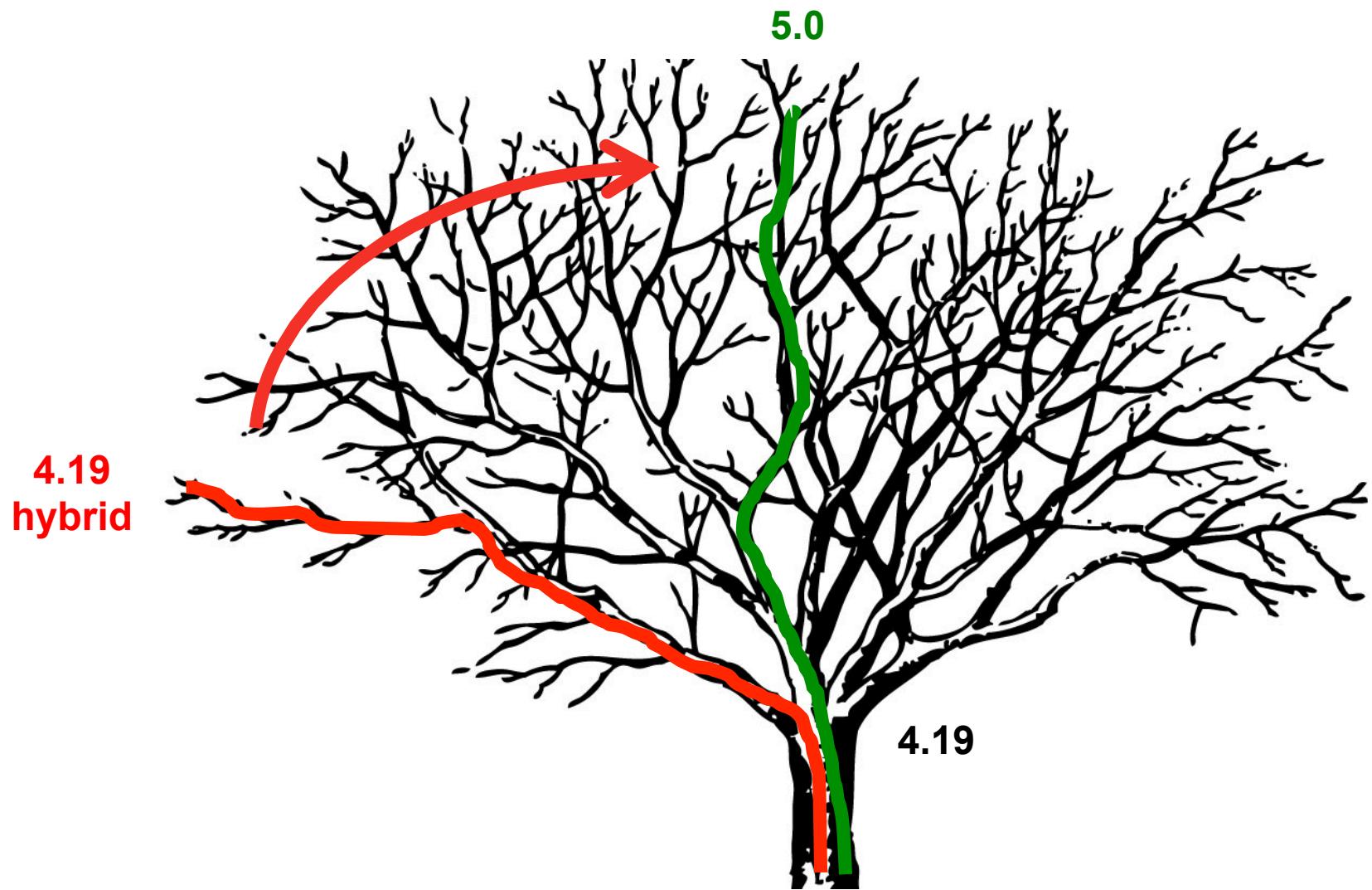


# Conclusions

- Changing hardware architectures require to continually rewriting/refactoring our codes
- Model codes are growing in length and complexity (changing a wheel on a running car)
- No consensus has emerged to deliver both high performance with high programmer productivity
- **Developing re-usable, performance portable and highly optimized middleware can help**
- **DSLs are an interesting way forward**
- Several efforts in weather/climate (ATMOL, ICON DSL, STELLA, ...)



# Ongoing



Merge back to trunk until end of 2014



# Next steps

- **PASC GridTools Project**

Generalize STELLA to grids on a sphere (global models) and other science domains (e.g. seismology)

- **DSL for physical parametrizations?**

- Loop reordering
- Data structures
- Demotion/Promotion of arrays



# Thank you!

## Cloud-Resolving Simulation of Winter Storm Kyrill

David Leutwyler, Oliver Fuhrer, Christoph Schär, Andrea Arteaga, Isabelle Bey, Mauro Bianco, Ben Cumming,  
Tobias Gysi, Xavier Lapillonne, Daniel Lüthi, Carlos Osuna, Anne Roches, Thomas Schulthess

**ETH**zürich





# Software Architecture

**“Algorithm”**  
Little or no hardware dependent code  
Maintained by domain-scientist

## Separation of concerns

**“Middleware”**  
Re-usable software components  
Domain-specific  
Inter-operable  
Performance portable  
Performance optimizable  
Maintained by computer-scientist

## Separation of concerns

### Refactored COSMO

