

# Parallel Algorithms

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# Outline

- 1 Model problem
- 2 Introduction to deal.ii

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# What do we want to do?

Solve a PDE numerically.

Test example: Find  $u$  such that

$$\begin{aligned} -\Delta u &= f, & \text{in } \Omega \subset \mathbb{R}^2 \\ u &= 0, & \text{on } \partial\Omega \end{aligned}$$

where  $\Omega = [-1, 1]^2$ , and  $f = 1$ .

# What do we want to do

For setting up the spatial FE approximation, the first step is to rewrite the above equation in variational form.

Let  $V = \{v : \|\nabla v\| + \|v\| < \infty, v|_{\partial\Omega} = 0\}$ . Multiplying the equation with a test-function  $v \in V$  and integrating over  $\Omega$  using Green's formula with the homogeneous Dirichlet boundary conditions, we obtain

$$\begin{aligned} \int_{\Omega} f v \, dx &= - \int_{\Omega} \Delta u v \, dx \\ &= \int_{\Omega} \nabla u \cdot \nabla v \, dx - \int_{\partial\Omega} \mathbf{n} \cdot \nabla u v \, dx \\ &= \int_{\Omega} \nabla u \cdot \nabla v \, dx \end{aligned}$$

# What do we want to do

The variational form is thus defined to be the following problem:  
Find  $u \in V$  such that

$$\int_{\Omega} \nabla u \cdot \nabla v \, dx = \int_{\Omega} f v \, dx, \quad \forall v \in V$$

# What do we want to do

In order to formulate the discretization in space, we decompose the infinite-dimensional computational domain  $\Omega$  into finite-dimensional subsets (elements) with a characteristic size  $h$ . Let  $\mathcal{K}$  be a triangulation of  $\Omega$ , and let  $V_h \subset V$  be the subspace of continuous piecewise linears on  $\mathcal{K}$

$$V_h = \{v \in V, v|_{\partial\Omega} = 0\}$$

With this choice of approximation space, the discrete space counterpart of the equation reads:

Find  $U \in V_h$  such that

$$\int_{\Omega} \nabla U \cdot \nabla v \, dx = \int_{\Omega} f v \, dx, \quad \forall v \in V_h$$

## What do we want to do

Next, to compute the finite element approximation  $U$  we let  $\{\varphi_i\}_{i=1}^N$  be the basis for the subspace  $V_h$ . Since  $U$  belong to  $V_h$  it can be written as:

$$U = \sum_{j=1}^N \mathbf{u}_j \varphi_j$$

with  $N$  unknowns  $\mathbf{u}_j, j = 1, 2, \dots, N$ , to be found.

This equation can be rewritten as a linear system by inserting the representation  $U = \sum_{j=1}^N \mathbf{u}_j \varphi_j$ . Using the notation

$$A_{ij} = \int_{\Omega} \nabla \varphi_i \nabla \varphi_j \, dx, \quad b_i = \int_{\Omega} f \varphi_i \, dx, \quad i = 1, 2, \dots, N$$

we have

$$b_i = \sum_{j=1}^N A_{ij} \mathbf{u}_j, \quad i = 1, 2, \dots, N$$



# What do we want to do

The linear system for the unknowns  $\mathbf{u}_j$  in matrix form:

$$\mathbf{A}\mathbf{u} = \mathbf{b}$$

Now we know what we are going to solve, and we can look at how to compute  $A_{ij}$  and  $\mathbf{b}_i$  (form the integrals).

In the finite element method, this is most commonly done using some quadrature.

## What do we want to do

We first split the integral over the whole domain into integrals over all cells,

$$A_{ij}^K = \sum_{K \in \mathcal{K}} \int_K \nabla \varphi_i \nabla \varphi_j$$

$$b_i^K = \sum_{K \in \mathcal{K}} \int_K f \varphi_i$$

and then approximate the integrals in each cell  $K$  by quadrature

$$A_{ij}^K \approx \sum_q \int_K \nabla \varphi_i(x_q^K) \nabla \varphi_j(x_q^K) \omega_j^K$$

$$b_i^K \approx \sum_q \int_K f(x_q^K) \varphi_i(x_q^K) \omega_j^K$$

# What do we want to do

After  $A$  and  $\mathbf{b}$  are made available, we have to choose a suitable numerical solution to solve the system.

- fast
- accurate
- robust

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# What is deal.ii

DEAL.II<sup>1</sup>: A Finite Element Differential Equations Analysis Library

- a C++ program library targeted at the computational solution of partial differential equations using adaptive finite elements.
- aims: to enable rapid development of modern finite element codes, using among other aspects adaptive meshes and a wide array of tools classes often used in finite element program.
- seemles using 1D, 2D or 3D programs.
- locally refined grids, adaptive refinement strategies and error indicators and error estimators.

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<sup>1</sup><http://www.dealii.org/>

# What is deal.ii

DEAL.II<sup>1</sup>: A Finite Element Differential Equations Analysis Library

- $h$ ,  $p$ ,  $hp$  refinement.
- continuous and discontinuous elements.
- support for a variety of finite elements.
- complete stand-alone linear algebra library.
- interface to other packages such as Trilinos, PETSc, METIS and P4est.
- smooth transition from serial to parallel.
- online documentation.

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# What is deal.ii

DEAL.II<sup>1</sup>: A Finite Element Differential Equations Analysis Library

- Modern software techniques that make access to the complex data structures and algorithms as transparent as possible.
- Support for several output formats.
- Portable support for a variety of computer platforms and compilers.
- Free source code under an Open Source license.
- open to contributors.

For its creation, its principal authors have received the 2007 J. H. Wilkinson Prize for Numerical Software.

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<sup>1</sup><http://www.dealii.org/>

# What is Trilinos

The Trilinos<sup>2</sup> Project is an effort to develop and implement robust algorithms and enabling technologies using modern object-oriented software design, while still leveraging the value of established libraries such as PETSc, Metis/ParMetis, SuperLU, Aztec, the BLAS and LAPACK. It emphasizes abstract interfaces for maximum flexibility of component interchanging, and provides a full-featured set of concrete classes that implement all abstract interfaces.

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<sup>2</sup><http://trilinos.sandia.gov/about.html>



# What is Trilinos

Deal.II has interface with two packages from Trilinos:

- Stratimikos: Thyra-based strategies for linear solvers
- Sacado: Automatic Differentiation Tools for C++ Codes

# Programming in deal.ii

- mesh (choice of finite elements)
- assembly of matrices (choice of basis functions)
- solution methods (nonlinear and linear)
- **paraelization tools**
- visualization

## Mesh- and finite-element related:

```
#include <deal.II/grid/tria.h>
#include <deal.II/dofs/dof_handler.h>
#include <deal.II/grid/grid_generator.h>
#include <deal.II/grid/tria_accessor.h>
#include <deal.II/grid/tria_iterator.h>
#include <deal.II/dofs/dof_accessor.h>

#include <deal.II/fe/fe_values.h>
#include <deal.II/base/quadrature_lib.h>

#include <deal.II/base/function.h>
```

# Matrix/vector data structure and

```
#include <deal.II/lac/vector.h>
#include <deal.II/lac/full_matrix.h>
#include <deal.II/lac/sparse_matrix.h>
#include <deal.II/lac/compressed_sparsity_pattern.h>

#include <deal.II/lac/solver_cg.h>
#include <deal.II/lac/precondition.h>
#include <deal.II/lac/sparse_direct.h>

#include <deal.II/lac/trilinos_precondition.h>
```

## Making the grid:

```
void laplace_problem::make_grid ()
{
    GridGenerator::hyper_cube (triangulation, -1, 1);

    triangulation.refine_global (n_refinement_steps);
    std::cout << "Total number of cells: "
        << triangulation.n_cells()
        << std::endl;
}
```

```
void laplace_problem::setup_system ()
{
    dof_handler.distribute_dofs (fe);
    std::cout << "Number of degrees of freedom: "
        << dof_handler.n_dofs()
        << std::endl;
    CompressedSparsityPattern c_sparsity(dof_handler.n_dofs())
        ;
    DoFTools::make_sparsity_pattern (dof_handler , c_sparsity);
    sparsity_pattern.copy_from(c_sparsity);

    system_matrix.reinit (sparsity_pattern);

    solution.reinit (dof_handler.n_dofs());
    system_rhs.reinit (dof_handler.n_dofs());
}
```

```
void laplace_problem::assemble_system ()
{
    QGauss<2>    quadrature_formula(2);
    FEValues<2> fe_values (fe, quadrature_formula,
update_values | update_gradients | update_JxW_values);
    const unsigned int    dofs_per_cell = fe.dofs_per_cell;
    const unsigned int    n_q_points   = quadrature_formula.
        size();

    FullMatrix<double>    cell_matrix (dofs_per_cell,
        dofs_per_cell);
    Vector<double>        cell_rhs (dofs_per_cell);

    std::vector<unsigned int> local_dof_indices (dofs_per_cell
        );
}
```

```
DoFHandler<2>::active_cell_iterator
  cell = dof_handler.begin_active(),
  endc = dof_handler.end();
for (; cell!=endc; ++cell)
{
  fe_values.reinit (cell);
  cell_matrix = 0;
  cell_rhs = 0;
  for (unsigned int i=0; i<dofs_per_cell; ++i)
for (unsigned int j=0; j<dofs_per_cell; ++j)
  for (unsigned int q_point=0; q_point<n_q_points; ++q_point
    )
    cell_matrix(i,j) += (fe_values.shape_grad (i, q_point) *
fe_values.shape_grad (j, q_point) *
fe_values.JxW (q_point));
```



```

    for (unsigned int i=0; i<dofs_per_cell; ++i)
for (unsigned int q_point=0; q_point<n_q_points; ++q_point)
    cell_rhs(i) += (fe_values.shape_value (i, q_point) *
    1 *
    fe_values.JxW (q_point));

    cell->get_dof_indices (local_dof_indices);

    for (unsigned int i=0; i<dofs_per_cell; ++i)
for (unsigned int j=0; j<dofs_per_cell; ++j)
    system_matrix.add (local_dof_indices[i],
    local_dof_indices[j],
    cell_matrix(i,j));

    for (unsigned int i=0; i<dofs_per_cell; ++i)
system_rhs(local_dof_indices[i]) += cell_rhs(i);
}

```

```
std::map<unsigned int, double> boundary_values;  
VectorTools::interpolate_boundary_values (dof_handler,  
MatrixTools::apply_boundary_values (boundary_values,  
    system_matrix,  
    solution,  
    system_rhs));  
}
```

# Solving the linear system: direct method

```
void laplace_problem::solve_direct ()
{
    SparseDirectUMFPACK direct_solver;
    direct_solver.initialize(system_matrix);
    direct_solver.vmult (solution, system_rhs);
}
```

# Solving the linear system: unpreconditioned CG

```
void laplace_problem::solve_cg ()
{
    SolverControl    solver_control (system_matrix.m(), 1e-12);

    SolverCG<>      solver (solver_control);

    solver.solve (system_matrix, solution, system_rhs,
PreconditionIdentity());
    std::cout<< "CG iterations without preconditioner:"...
                <<solver_control.last_step()<<std::endl;
}
```

## Solving the linear system: AMG-preconditioned CG

```

void laplace_problem::solve_amg ()
{
    Amg_preconditioner.reset ();
    Amg_preconditioner = std_cxx11::shared_ptr<TrilinosWrappers::PreconditionAMG>
        (new TrilinosWrappers::PreconditionAMG());

    std::vector<std::vector<bool> > constant_modes;
    std::vector<bool> components (3,true);
    components[2] = false;
    DoFTools::extract_constant_modes (dof_handler, components,
        constant_modes);
    TrilinosWrappers::PreconditionAMG::AdditionalData Amg_data;
    Amg_data.constant_modes = constant_modes;
    Amg_data.elliptic = true;
    Amg_data.higher_order_elements = true;
    Amg_data.smoother_sweeps = 2;
    Amg_data.aggregation_threshold = 0.02;
    Amg_preconditioner->initialize(system_matrix, Amg_data);

    SolverControl solver_control (system_matrix.m(), 1e-12);
    SolverCG<> solver (solver_control);
    solver.solve (system_matrix, solution, system_rhs,
    *Amg_preconditioner);
    std::cout<< "CG iterations with AMG preconditioner:"<<solver_control.last_step()<<std::
        endl;
}

```

## The actual execution part:

```
void laplace_problem::run (int n_refs)
{
    Vector<double>  init_sol;
    Vector<double>  init_rhs;
    double mesh_size;
    n_refinement_steps = n_refs;
    std::cout<< "Number of refinements: " <<n_refinement_steps
              << std::endl;

    mesh_size = 2*std::pow(0.5, double(n_refinement_steps));
    pcout << "Mesh size: " << mesh_size<< std::endl;
    make_grid ();
    setup_system();
    assemble_system ();
    init_rhs = system_rhs;
    init_sol = solution;
}
```

```
computing_timer.enter_section("Solve system directly");
solve_direct ();
computing_timer.exit_section("Solve system directly");

solution = init_sol;
system_rhs = init_rhs;
computing_timer.enter_section("Solve system (CG)");
solve_cg ();
computing_timer.exit_section("Solve system (CG)");

solution = init_sol;
system_rhs = init_rhs;
computing_timer.enter_section("Solve system (AMG)");
solve_amg ();
computing_timer.exit_section("Solve system (AMG)");

output_results ();
}
```