# Automated finite difference modelling on structured grids, and a variety of compute architectures

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#### Motivation



- SBLI is a legacy CFD code developed at the University of Southampton
- Written in Fortran90, for solving the compressible Navier-Stokes equations on block structured grids
- Fourth order central differencing for spatial discretisation
- Currently capable of running on CPU clusters
- However, the architectures are evolving rapidly.

#### Motivation



- Current architectures include, Multi-core CPU's, GPU's, XeonPhi cards
- Future architectures: Energy efficient systems from ARM and others
- Porting existing SBLI code on these architectures requires a complete rewrite and challenging
- Newer architecture might arrive while we are still porting to the current architectures

Ways to future proof codes?

## Approach

# Southampton

- Key components of numerical solution are
  - Problem description
  - Numerical method
  - Writing code
- One way to address future proofing is through separation of concerns using high level abstractions

## Approach

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Problem User **Numerical** method framework Code translation to Numerical Algorithm various architectures developer Computational scientist

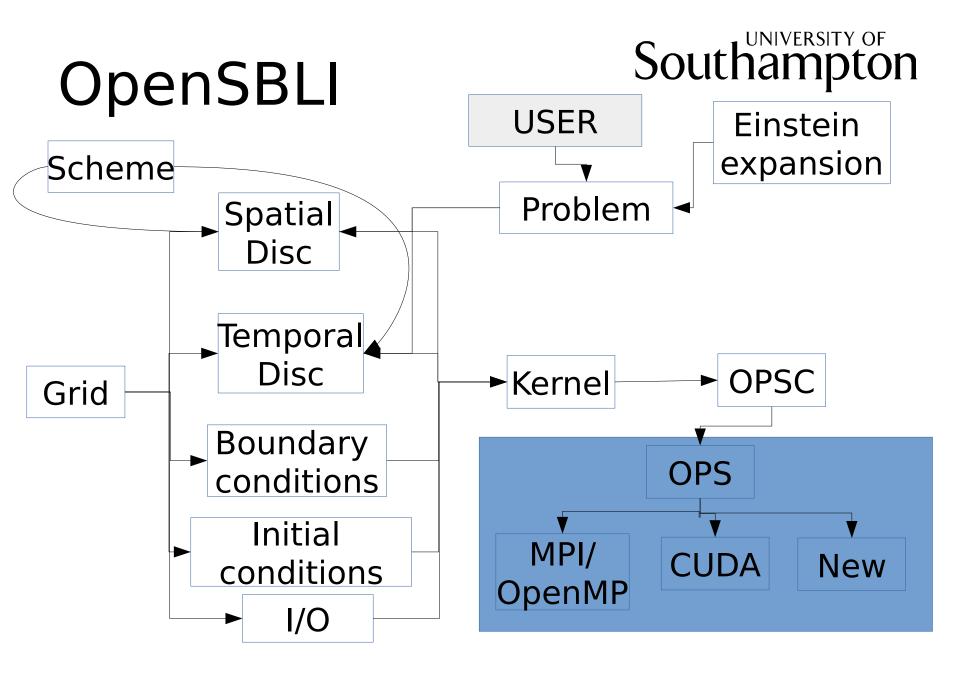
## Approach

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Problem User **Numerical** method framework Code translation to **OpenSBLI** various architectures framework We use the **OPS** library

## OpenSBLI

- Written in Python and uses SymPy for the numerical method
- User specifies
  - Equations in Einstein notation
  - Order of accuracy of the spatial scheme (central finite differences)
  - Time stepping scheme
  - Boundary conditions
  - Initial conditions
- Output is C code that can be compiled on various architectures



## OpenSBLI

- The OpenSBLI framework has the following additional advantages
  - Flexible choice of equations
  - Spatial order can be easily varied
  - Models need not require a rewrite for new architectures
- For eg, a 50 line high-level problem definition, for the 3D compressible N-S equations, results in 20K lines of generated code for MPI and CUDA
- Details of OpenSBLI framework can be found in http://arxiv.org/abs/1609.01277

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## OpenSBLI

#### Example

```
# Number of dimensions for the problem
ndim = 3
# Define the compresible Navier-Stokes equations in Einstein notation.
mass = "Eq(Der(rho,t), - Conservative(rho*u j,x j))"
momentum = "Eq(Der(rhou i,t) , -Conservative(rhou i*u j + KD(i, j)*p ,x j) + Der(tau i j,x j))"
energy = "Eq(Der(rhoE,t), - Conservative((p+rhoE)*u j,x j) + Der(q j,x j) + Der(u i*tau i j ,x j))"
equations = [mass, momentum, energy]
# Substitutions
stress tensor = ^{"Eq(tau \ i \ j, (1.0/Re)*(Der(u \ i,x \ j)+Der(u \ j,x \ i)-(2/3)* KD(i,j)* Der(u \ k,x \ k)))"
heat flux = Eq(q j, (1.0/((qama-1)*Minf*Minf*Pr*Re))*Der(T,x j))"
substitutions = [stress tensor, heat flux]
# Define all the constants in the equations
constants = ["Re", "Pr", "gama", "Minf"]
# Define coordinate direction symbol (x) this will be x i, x j, x k
coordinate symbol = "x"
# Formulas for the variables used in the equations
velocity = "Eq(u i, rhou i/rho)"
pressure = Eq(p, (gama-1)*(rhoE - rho*(1/2)*(u j*u j)))"
temperature = "Eq(T, p*gama*Minf*Minf/(rho))"
formulas = [velocity, pressure, temperature]
```

```
int iter range69[] = {0, nx0, 0, nx1, 0, nx2};
ops par loop(taylor green vortex block0 69 kernel, "Residual of equation", taylor green vortex block, 3, iter range69,
ops arg dat(wk20, 1, stencil0, "double", OPS READ),
ops arg dat(wk47, 1, stencil0, "double", OPS READ),
ops arg dat(wk21, 1, stencil0, "double", OPS READ),
ops arg dat(wk28, 1, stencil0, "double", OPS READ),
ops arg dat(ul, 1, stencil0, "double", OPS READ),
ops arg dat(wk29, 1, stencil0, "double", OPS READ),
ops arg dat(wk19, 1, stencil0, "double", OPS READ),
ops arg dat(wk0, 1, stencil0, "double", OPS READ),
ops arg dat(wk15, 1, stencil0, "double", OPS READ),
ops_arg_dat(wk35, 1, stencil0, "double", OPS_READ),
ops arg dat(wk18, 1, stencil0, "double", OPS READ),
ops arg dat(wkl1, 1, stencil0, "double", OPS READ),
ops arg dat(wk12, 1, stencil0, "double", OPS READ),
ops arg dat(wk31, 1, stencil0, "double", OPS READ),
ops arg dat(wk8, 1, stencil0, "double", OPS READ),
ops arg dat(wk37, 1, stencil0, "double", OPS READ),
ops arg dat(wk34, 1, stencil0, "double", OPS READ),
ops arg dat(wk10, 1, stencil0, "double", OPS READ),
ops arg dat(wk30, 1, stencil0, "double", OPS READ),
ops arg dat(wk39, 1, stencil0, "double", OPS READ),
ops arg dat(wk44, 1, stencil0, "double", OPS READ),
ops arg dat(u0, 1, stencil0, "double", OPS READ),
ops_arg_dat(wk40, 1, stencil0, "double", OPS READ),
ops arg dat(wk46, 1, stencil0, "double", OPS READ),
ops arg dat(wk45, 1, stencil0, "double", OPS READ),
ops arg dat(wk41, 1, stencil0, "double", OPS READ),
ops arg dat(wk25, 1, stencil0, "double", OPS READ),
ops arg dat(wk3, 1, stencil0, "double", OPS READ),
ops arg dat(wk7, 1, stencil0, "double", OPS READ),
ops arg dat(wkl, 1, stencil0, "double", OPS READ),
ops arg dat(wk2, 1, stencil0, "double", OPS READ),
ops arg dat(wk33, 1, stencil0, "double", OPS READ),
ops arg dat(wk6, 1, stencil0, "double", OPS READ),
ops arg dat(wk32, 1, stencil0, "double", OPS READ),
ops arg dat(wk38, 1, stencil0, "double", OPS READ),
ops arg dat(wk14, 1, stencil0, "double", OPS READ),
ops_arg_dat(wk42, 1, stencil0, "double", OPS_READ),
ops arg dat(wk26, 1, stencil0, "double", OPS READ),
ops arg dat(wk43, 1, stencil0, "double", OPS READ),
ops arg dat(u2, 1, stencil0, "double", OPS READ),
ops arg dat(wk22, 1, stencil0, "double", OPS READ),
ops arg dat(wk24, 1, stencil0, "double", OPS READ),
ops arg dat(wk27, 1, stencil0, "double", OPS READ),
ops arg dat(wk5, 1, stencil0, "double", OPS READ),
ops arg dat(wk23, 1, stencil0, "double", OPS READ),
ops arg dat(wk9, 1, stencil0, "double", OPS READ),
ops arg dat(wk4, 1, stencil0, "double", OPS READ),
ops arg dat(wk17, 1, stencil0, "double", OPS READ),
ops arg dat(wkl3, 1, stencil0, "double", OPS READ),
ops arg dat(wk36, 1, stencil0, "double", OPS READ),
ops_arg_dat(wk16, 1, stencil0, "double", OPS_READ),
ops arg dat(wk49, 1, stencil0, "double", OPS WRITE),
ops arg dat(wk48, 1, stencil0, "double", OPS WRITE),
ops arg dat(wk50, 1, stencil0, "double", OPS WRITE),
ops arg dat(wk51, 1, stencil0, "double", OPS WRITE),
ops arg dat(wk52, 1, stencil0, "double", OPS WRITE));
```

Example of auto-generated kernel call for computing right hand side of Compressible Navier-Stokes solution

```
void taylor green vortex block0 69 kernel(const double *wk20 , const double *wk47 , const double *wk21 , const double
*wk28 , const double *u1 , const double *wk29 , const double *wk19 , const double *wk0 , const double *wk15 , const
double *wk35 , const double *wk18 , const double *wk11 , const double *wk12 , const double *wk31 , const double *wk8 ,
const double *wk37 , const double *wk34 , const double *wk10 , const double *wk30 , const double *wk39 , const double
*wk44 , const double *uθ , const double *wk40 , const double *wk46 , const double *wk45 , const double *wk41 , const
double *wk25 , const double *wk3 , const double *wk7 , const double *wk1 , const double *wk2 , const double *wk3 ,
const double *wk6 , const double *wk32 , const double *wk38 , const double *wk14 , const double *wk42 , const double
*wk26 , const double *wk43 , const double *u2 , const double *wk22 , const double *wk24 , const double *wk27 , const
double *wk5 , const double *wk23 , const double *wk9 , const double *wk4 , const double *wk17 , const double *wk13 ,
const double *wk36 , const double *wk16 , double *wk49 , double *wk48 , double *wk50 , double *wk51 , double *wk52)
                wk48[OPS ACC52(0,0,0)] = -wk11[OPS ACC11(0,0,0)] - wk14[OPS ACC35(0,0,0)] - wk2[OPS ACC30(0,0,0)];
                     wk49[OPS ACC51(0,0,0)] = rinv11*(wk0[OPS ACC7(0,0,0)] + wk44[OPS ACC20(0,0,0)]) +
                                  rinv11*(wk3[OPS ACC27(0,0,0)] + wk47[OPS ACC1(0,0,0)]) + rinv11*((rc4)*wk16[OPS ACC50(0,0,0)] - rinv11*((rc4)*wk16[OPS ACC50(0,0,0)]) + rinv11*((rc4)*wk16[OPS ACC50
                                   rc6*wk44[OPS\ ACC20(0,0,0)] - rc6*wk47[OPS\ ACC1(0,0,0)]) - wk18[OPS\ ACC10(0,0,0)] - wk20[OPS\ ACC0(0,0,0)] - wk20[OPS
                                   wk29[OPS ACC5(0,0,0)] - wk39[OPS ACC19(0,0,0)];
                        wk50[OPS ACC53(0,0,0)] = rinv11*(wk13[OPS ACC48(0,0,0)] + wk42[OPS ACC36(0,0,0)]) +
                                   rinv11*(wk43[0PS ACC38(0,0,0)] + wk5[0PS ACC43(0,0,0)]) + rinv11*((rc4)*wk26[0PS ACC37(0,0,0)] - rinv11*(wk43[0PS ACC37(0,0,0)]) + rinv1*(wk43[0PS ACC37(0,0,0)]) + rinv1*(wk4
                                   rc6*wk42[OPS ACC36(0,0,0)] - rc6*wk43[OPS ACC38(0,0,0)]) - wk21[OPS ACC2(0,0,0)] - wk27[OPS ACC42(0,0,0)] - wk27[OPS AC
                                  wk31[OPS ACC13(0,0,0)] - wk41[OPS ACC25(0,0,0)];
                        wk51[0PS ACC54(0,0,0)] = rinv11*(wk22[0PS ACC40(0,0,0)] + wk45[0PS ACC24(0,0,0)]) +
                                   rinv11*(wk46[0PS ACC23(0,0,0)] + wk7[0PS ACC28(0,0,0)]) + rinv11*((rc4)*wk4[0PS ACC46(0,0,0)] - rinv11*(wk46[0PS ACC46(0,0,0)]) + rinv1*(wk46[0PS ACC46(0,0,0)]) + rinv1*(wk46
                                   rc6*wk45[OPS ACC24(0,0,0)] - rc6*wk46[OPS ACC23(0,0,0)]) - wk28[OPS ACC3(0,0,0)] - wk32[OPS ACC33(0,0,0)] -
                                   wk36[OPS ACC49(0,0,0)] - wk9[OPS ACC45(0,0,0)];
                        wk52[OPS \ ACC55(0,0,0)] = rinv11*rinv12*rinv13*rinv14*wk19[OPS \ ACC6(0,0,0)] +
                                   rinv11 \overline{r}rinv12 rinv13 rinv14 wk30 [OPS ACC18(0,0,0)] + rinv11 \overline{r}rinv12 rinv13 rinv14 wk35 [OPS ACC9(0,0,0)] + rinv11 \overline{r}rinv12 rinv13 rinv14 rinv14 rinv15 rinv16 rinv16 rinv16 rinv16 rinv16 rinv17 rinv17 rinv17 rinv18 
                                  rinv11*(wk0[0PS ACC7(0,0,0)] + wk44[0PS ACC20(0,0,0)])*u0[0PS ACC21(0,0,0)] + wk44[0PS ACC20(0,0,0)] + wk44[0PS ACC20(0,0,0)])*u0[0PS ACC21(0,0,0)] + wk44[0PS ACC20(0,0,0)] + wk44[0PS ACC20(0,0,0)])*u0[0PS ACC21(0,0,0)] + wk44[0PS ACC20(0,0,0)] + wk44[
                                   rinv11*(wk1[0PS ACC29(0,0,0)] + wk23[0PS ACC44(0,0,0)])*wk1[0PS ACC29(0,0,0)] +
                                   rinv11*(wk1[0PS ACC29(0,0,0)] + wk23[0PS ACC44(0,0,0)])*wk23[0PS ACC44(0,0,0)] +
                                   rinv11*(wk12[OPS ACC12(0,0,0)] + wk37[OPS ACC15(0,0,0)])*wk12[OPS ACC12(0,0,0)] + wk37[OPS ACC
                                   rinv11*(wk12[OPS ACC12(0,0,0)] + wk37[OPS ACC15(0,0,0)])*wk37[OPS ACC15(0,0,0)] +
                                   rinv11*(wk13[0PS ACC48(0,0,0)] + wk42[0PS ACC36(0,0,0)])*u1[0PS ACC4(0,0,0)] +
                                   rinv11*(wk15[OPS ACC8(0,0,0)] + wk8[OPS ACC14(0,0,0)])*wk15[OPS ACC8(0,0,0)] +
                                   rinv11*(wk15[0PS ACC8(0,0,0)] + wk8[0PS ACC14(0,0,0)])*wk8[0PS ACC14(0,0,0)] + wk8[0PS ACC14(0,0,0)]
                                   rinv11*(wk22[OPS ACC40(0,0,0)] + wk45[OPS ACC24(0,0,0)])*u2[OPS ACC39(0,0,0)] +
                                   rinv11*(wk3[0PS ACC27(0,0,0)] + wk47[0PS ACC1(0,0,0)])*u0[0PS ACC21(0,0,0)] +
                                   rinv11*(wk43[0PS\_ACC38(0,0,0)] + wk5[0PS\_ACC43(0,0,0)])*u1[0PS\_ACC4(0,0,0)] + wk5[0PS\_ACC43(0,0,0)]
                                  rinv11*(wk46[0PS ACC23(0,0,0)] + wk7[0PS ACC28(0,0,0)])*u2[0PS ACC39(0,0,0)] +
                                   rinv11*((rc4)*wk16[OPS ACC50(0,0,0)] - rc6*wk44[OPS ACC20(0,0,0)] -
                                  rc6*wk47[0PS ACC1(0,0,0)])*u0[0PS ACC21(0,0,0)] + rinv11*(-rc6*wk17[0PS ACC47(0,0,0)] - rc6*wk17[0PS ACC47(0,0,0)] - rc6*wk47[0PS 
                                  rc6*wk25[OPS ACC26(0,0,0)] + (rc4)*wk34[OPS ACC16(0,0,0)])*wk34[OPS ACC16(0,0,0)] +
                                   rinv11*(-rc6*wk17[0PS ACC47(0,0,0)] + (rc4)*wk25[0PS ACC26(0,0,0)] -
                                   rc6*wk34[0PS ACC16(0,0,0)])*wk25[0PS ACC26(0,0,0)] + rinv11*((rc4)*wk17[0PS ACC47(0,0,0)] -
                                   rc6*wk25[OPS ACC26(0,0,0)] - rc6*wk34[OPS ACC16(0,0,0)])*wk17[OPS ACC47(0,0,0)] +
                                   rinv11*((rc4)*wk26[OPS ACC37(0,0,0)] - rc6*wk42[OPS ACC36(0,0,0)] -
                                   rc6*wk43[0PS ACC38(0,0,0)])*u1[0PS ACC4(0,0,0)] + rinv11*((rc4)*wk4[0PS ACC46(0,0,0)] -
                                   rc6*wk45[0PS ACC24(0,0,0)] - rc6*wk46[0PS ACC23(0,0,0)])*u2[0PS ACC39(0,0,0)] - wk10[0PS ACC17(0,0,0)] -
                                  wk24[OPS\ ACC41(0,0,0)]\ -\ wk33[OPS\ ACC31(0,0,0)]\ -\ wk38[OPS\ ACC34(0,0,0)]\ -\ wk40[OPS\ ACC22(0,0,0)]\ -\ wk30[OPS\ ACC34(0,0,0)]\ -\ wk40[OPS\ ACC32(0,0,0)]\ -\ wk30[OPS\ ACC34(0,0,0)]\ -\ wk30[OPS\ ACC34(0,0,0)]\ -\ wk40[OPS\ ACC34(0,0,0)]\ -\ wk30[OPS\ ACC34(0,0,0)]\ -\ wk40[OPS\ ACC34(0,0,0)]\ -\ 
                                  wk6[0PS ACC32(\theta,\theta,\theta)];
```

Example of auto-generated kernel for computing residual of Compressible Navier-Stokes solution

#### Results

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 MMS tests for the 2D advectiondiffusion equation

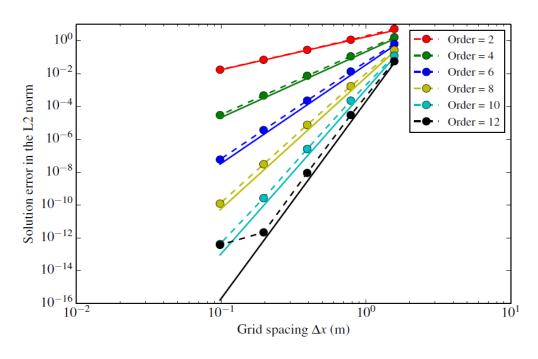


Figure 7: The absolute error (in the L2 norm) between the numerical solution  $\phi$  and the exact/manufactured solution  $\phi_m$ , from the suite of MMS simulations. The solid lines represent the expected convergence rate for each order.

Demonstration of solution convergence. Considering up to order 12. Image by Jacobs et al. (Submitted): http://arxiv.org/abs/1609.01277

#### Results

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- Compressible Navier-Stokes equations
- 3D Taylor-Green vortex problem
- Up to 1 billion grid points
- Re = 1600
- Architectures
  - CPU (ARCHER)
  - GPU (K40)

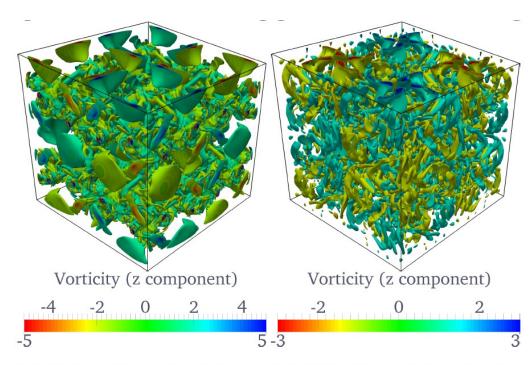


Figure 8: Visualisations of the non-dimensional vorticity (z-component) iso-contours, from the Taylor-Green vortex test case with a  $256^3$  grid, at various non-dimensional times. Top left to bottom right: non-dimensional time t = 0, 2.5, 10, 20.

Results from a Taylor-Green vortex test case. Image by Jacobs et al. (Submitted): http://arxiv.org/abs/1609.01277

#### Conclusions

- A new framework for the automated solution of finite difference methods on various architectures is developed and validated
- For easy debugging the framework writes the computations in Latex
- A 50 line high-level problem definition, for the compressible N-S equations, results in 20K lines of generated code for MPI and CUDA
- Separation of concerns enables better model maintainability, and future proofs the code as newer architectures arrive
- New algorithms and numerical methods can be readily implemented using the framework