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## Efficient and easily accessible Matlab codes for topology optimization

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## Motivation of the work

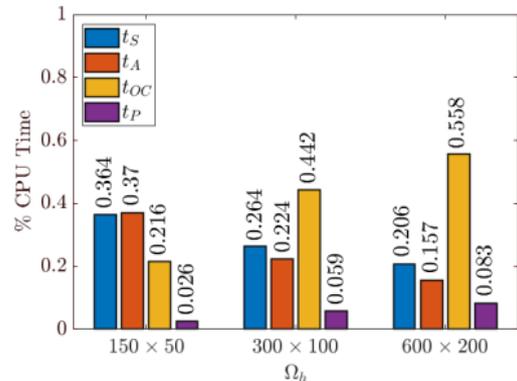
% CPU time distribution in top88<sup>(1)</sup>

$t_S$ : linear solve

$t_A$ : matrix assembly

$t_{OC}$ : OC update

$t_P$ : setup operations



(a)  $r_{\min} = 4, 8, 16$ , respectively

$t_S$  will substantially decrease when using highly efficient preconditioned solvers.

### Goals

- Cut all the times *other than*  $t_S$ , making the code highly efficient for medium-size problems ( $10^5 - 10^6$  elements);
- Keep the readability and flexibility of top88

<sup>(1)</sup>Andreassen et. al. (2011)-Efficient topology optimization in MATLAB using 88 lines of code, SMO



# Overview of the code and speedups<sup>(2)</sup>

## Minimum compliance

$$\begin{cases} \min_{\mathbf{x}} c(\hat{\mathbf{x}}) = \mathbf{f}^T \mathbf{u}(\hat{\mathbf{x}}) \\ K(\hat{\mathbf{x}}) \mathbf{u}(\hat{\mathbf{x}}) = \mathbf{f} \\ g(\hat{\mathbf{x}}) = \sum_{e=1}^m \hat{x}_e v_e - V_f |\Omega_h| \leq 0 \\ 0 \leq x_e \leq 1, \quad \forall e \end{cases}$$

$\hat{x}_e$ : physical densities,  $x_e$ : design variables

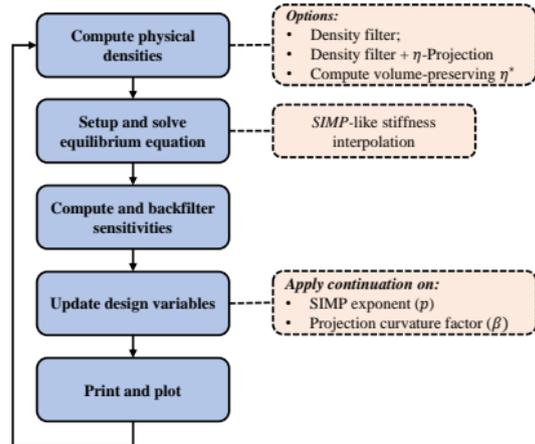
## Speedups

- Stiffness matrix assembly;
- Filtering operations and OC update;
- Overall acceleration strategy<sup>(3)</sup>

### Definition of:

- Continuation schemes
- Passive regions (Solid & Void)
- Neumann or Dirichlet b.c. for the filter ('imfilter')
- $\eta$ -projection (or others)

### Re-design loop: while loop < maxit



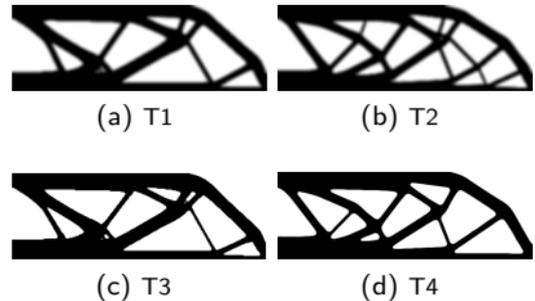
<sup>(2)</sup>Ferrari, Sigmund (2020)-A new generation 99 line Matlab code for compliance topology optimization and its extension to 3D, SMO

<sup>(3)</sup>Li et al. (2020)-Accelerated fixed-point formulation of Topology Optimization: application to compliance minimization problems, Mech. Res. Comm.



## Testing with the MBB beam example

- $\Omega_h = 600 \times 200$ ,  $V_f = 0.5$ ,  $r_{\min} = 8$
- Test cases
  - T1: Density Fiter,  $p = 3$ ;
  - T2: Density Fiter,  $p = 1 \rightarrow 3$ ;
  - T3: Density+Proj.  $p = 3$ ,  $\beta = 2 \rightarrow 24$ ;
  - T4: Density+Proj.  $p = 1 \rightarrow 3$ ,  $\beta = 2 \rightarrow 24$ ;



$t_S$ : linear solve,  $t_A$ : matrix assembly,  
 $t_{OC}$ : OC update,  $t_P$ : setup operations

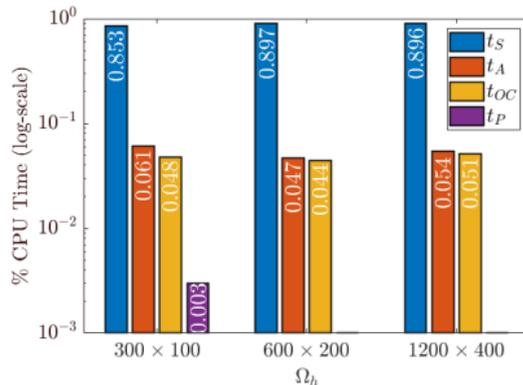


Table: Average iteration time (s) and **speedup factors**.

$\Omega_h$	$300 \times 100$ $r_{\min} = 4$	$600 \times 200$ $r_{\min} = 8$	$1200 \times 400$ $r_{\min} = 16$
top99neo(s)	0.231	1.19	5.69
top88U <sup>(4)</sup>	<b>1.55</b>	<b>1.57</b>	<b>1.78</b>
top88	<b>2.66</b>	<b>4.09</b>	<b>5.51</b>

<sup>(4)</sup>Use of `sparse2` for assembly and `conv2` for filtering



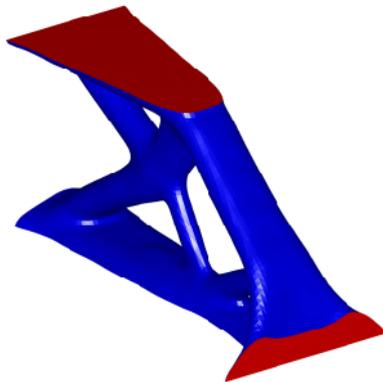
## Extension to 3D domains (top3D125)

- change elemental stiffness matrix (8-nodes hexahedron element);
- change reshape operations (12 lines total);

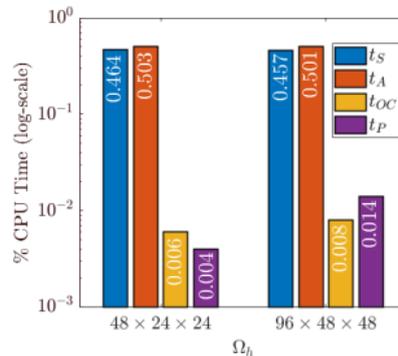
Table: Average iteration time (s) and **speedup factors**.

$\Omega_h$	$48 \times 24 \times 24$ $r_{\min} = \sqrt{3}$	$96 \times 48 \times 48$ $r_{\min} = 2\sqrt{3}$
top3D125(s)	1.79	14.20
top3Dmgcg <sup>(5)</sup>	<b>1.78</b>	<b>1.92</b>

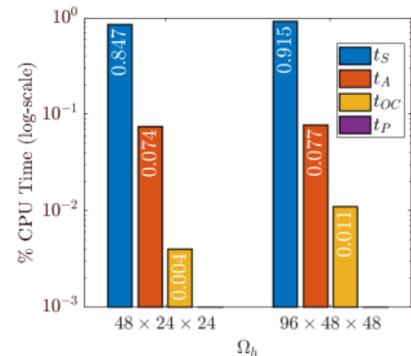
$$\Omega_h = 96 \times 48 \times 48, V_f = 0.12$$



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 $t_P$ : setup operations



(a) top3Dmgcg



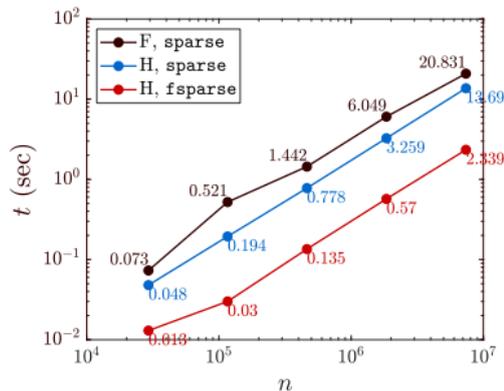
(b) top3D125

<sup>(5)</sup>Amir et.al. (2014)-On multigrid-CG for efficient topology optimization, SMO

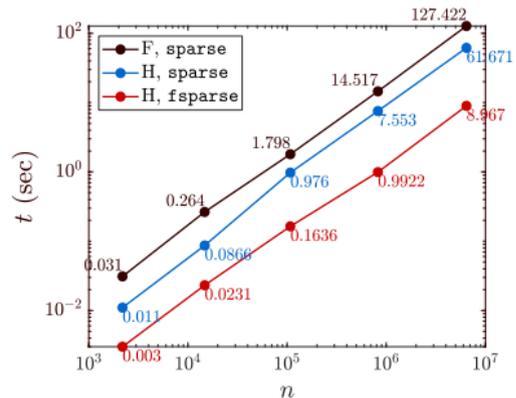


## Improving the stiffness matrix assembly

- Assemble only lower half  $K^{(s)}$  → cut  $\approx 45\%$  of CPU time and RAM;
- Define mesh-related indices as 'int32'<sup>(6)</sup> → RAM is cut to  $\approx 1/4$  and CPU time to  $\approx 1/10$ ;
- chol and similar work with  $K^{(s)}$  (not "\!\!"), (CG, MINRES can be adapted);



(a) 2D discretization



(b) 3D discretization

<sup>(6)</sup> <https://github.com/stefanengblom/stenglib>, Engblom, Lukarski (2015)-*Fast Matlab compatible sparse assembly on multicore computers*, Parallel Computing



## Improving the efficiency of the OC update

$\delta_- = \max\{0, x_{k,e} - \mu\}$ ,  $\delta_+ = \min\{1, x_{k,e} + \mu\}$  (local lower/upper bounds).

### Primal & dual variables updates

Compute  $(\mathbf{x}_{k+1}, \lambda_k^*)$  by iterations

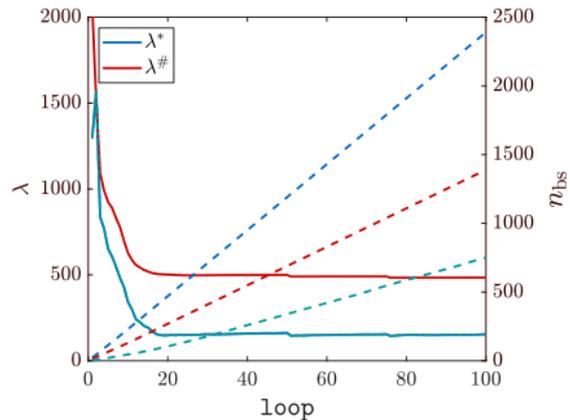
$$x_{k+1,e} = \max\{\delta_-, \min\{\delta_+, x_{k,e} \left(-\frac{\partial_e c(\mathbf{x}_k)}{\lambda \partial_e V(\mathbf{x}_k)}\right)^{\frac{1}{2}}\}\}$$

$$\lambda = \left( \frac{\sum_{e \in \mathcal{M}} x_{k,e} (-\partial_e c(\mathbf{x}_k) / \partial_e V(\mathbf{x}_k))^{1/2}}{g(\mathbf{x}_k) / \partial_e V(\mathbf{x}_k) - |\mathcal{L}| \delta_- - |\mathcal{U}| \delta_+} \right)^2$$

$$\mathcal{M} = \{e \mid \delta_- < x_e < \delta_+\}$$

$$\mathcal{L} = \{e \mid x_e = \delta_-\}$$

$$\mathcal{U} = \{e \mid x_e = \delta_+\}$$



$n_{\text{bs}}$ : cumulative number of “bisections”



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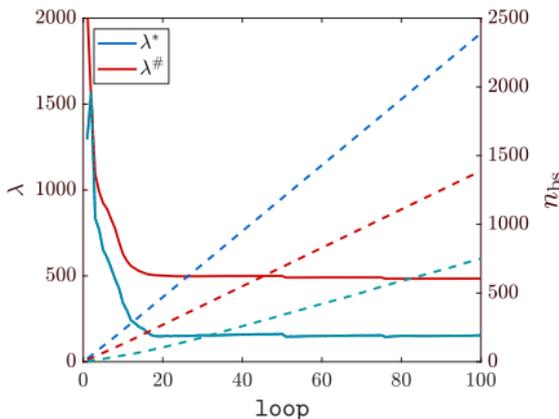
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Repeated filtering operations are avoided if we adopt **volume-preserving** filters.



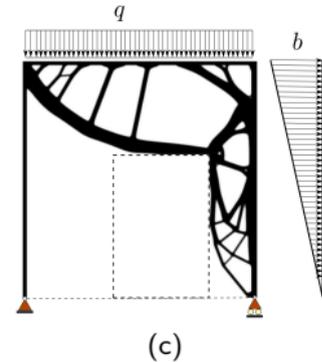
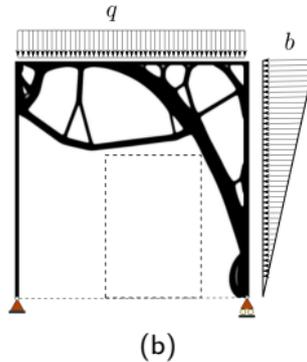
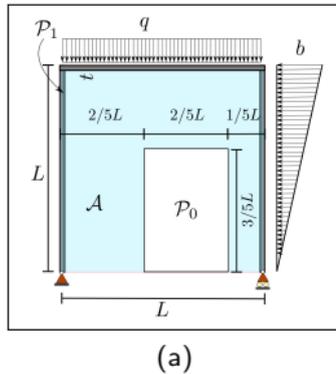
$n_{\text{bs}}$ : cumulative number of “bisections”

	$\Lambda = [0, 10^9]$	Est.	PD
$n_{\text{bs}}$	2390	1389	750
$t_{\text{stf}}(s)$	1.18	0.65	0.27
$t_{\text{vpf}}(s)$	0.04	0.03	0.03

## Introduction of passive (solid & void) elements

Reinforcement of a solid frame while keeping a void region

- $\Omega_h = 900 \times 900$  elements,  $V_f = 0.2$ ;
- Average cost per iteration: 10.8s ( $1.62 \cdot 10^6$  DOFs)



## Extension to linearized buckling: [topBuck250](#)



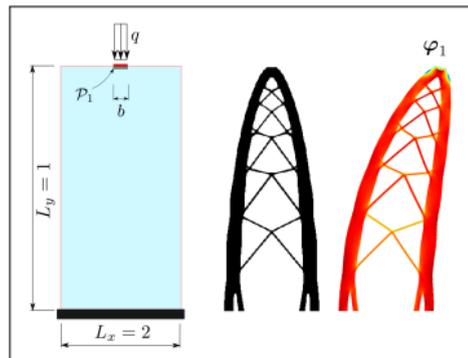
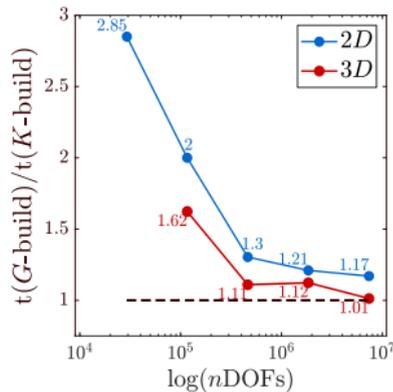
Topology Optimization with linearized buckling criteria in 250 lines of Matlab

Federico Ferrari · Ole Sigmund · James K. Guest

- Fully vectorized setup of the buckling eigenproblem and buckling load factors (BLFs) sensitivity analysis;
- Includes 4 design problems by default
  - (a) max BLF, s.t. {vol, compliance} constraints
  - (b) min vol, s.t. {BLF, compliance} constraints
  - (c) min Compliance, s.t. vol constraint
  - (d) min vol, s.t. compliance constraint
- Explicit OC update based on MMA-like approximations;

..COMING SOON!

set up buckling analysis  $\approx$  with the same cost as linear analysis





# Thank you for your attention

top99neo and top3D125 codes can be found at [www.topopt.dtu.dk](http://www.topopt.dtu.dk)

Visit also <https://www.ce.jhu.edu/topopt> for upcoming news and codes