



Simulation and Optimization of thermal distortions for milling processes





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Joint work with **Carsten Niebuhr** (ZeTeM)



MAPEX Bremen Material. Process. Excellence.

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(Modeling Optimization and Computing Technology SAS de CV, Monterrey, MX)







Background: Different Modelling / simulation / optimization problems from applications in joint projects with engineers All include: an explicit or implicit heat treatment parabolic heat equation coupling with mechanics or fluidmechanics elliptic or elliptic/parabolic equation and time dependent domain is part of the solution,

some other **nonlinearities** are included



Digital product twin – production twin (– performance twin)









Project in DFG Collaborative Research Centre 747 "Micro cold forming"









Application 2: Phase Transitions in Additive Manufacturing Processes (3D printing)

- Laser powder cladding
- Selective laser melting

Joint work with Andreas Luttmann,



Bohlen 2017

BIAS ID 172200

Annika Bohlen and Hannes Freiße (BIAS), Martin Hunkel and Jeremy Epp (IWT)

BMWi/AiF Project "MUSA – Characterization and Modelling of repeated phase transitions in tool steels during additive processes"





Application: Distortion in milling processes



Application 3: Distortion in milling processes





Joint work with

Carsten Niebuhr, Jost Vehmeyer, Iwona Piotrowska, and Peter Maaß Berend Denkena and Daniel Niederwestberg (IFW Hannover) Jonathan Montalvo-Urquizo and Maria G Villarreal-Marroquin (CIMAT / Modeling Optimization and Computing Technology SAS de CV, Monterrey, MX) Project in DFG Priority Program 1480 and DAAD-CONACYT exchange project





Thermal distortion in milling processes



Motivation:

Thermal challenges in the production process of structural components



Thermal challenges

- Significant shape deviation of the workpiece
- Shape errors especially between clamping elements
- Various clamping elements are needed

Final goal

Reduction of shape deviation by simulation and compensation of thermal effects







Milling/drilling of metal workpieces

Cutting process induces heating of workpiece, Thermal expansions produce deformation of workpiece under process, without correction, cutter removes material incorrectly

Thermomechanical model for cutting process

Heat and forces are produced by cutting tool.

Process model: based on tool shape and velocity, chip thickness, ... Chip thickness depends on tool and workpiece positions Here, thermomechanical deformation of workpiece enters!

Tool path is adjustable / controllable!

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Detailed modelling and simulation approach







Process model: Cutting Tool

Aim

General method for contact zone analysis

Procedure

- Discretization of detail tool model along the cutting edge
- Analysis of tool model for the discrete parts of the cutting edge
- Determination of local tool characteristics, like coordinate transformation R(s,t)
- Generation of tool model by rotation of the cutting edge segments
- Assignment of tool characteristics to the body of revolution







Process model: Forces and heat source

Aim

Determination of the localized thermal and mechanical workpiece load

Procedure

- Assignment of dexel cut points (*DCP*) on the tool model
- Mapping the DCPs on the discrete tool face elements (TFE)
- Approximation of position angle φ_i for every *DCP*
- Forces are directly measurable
- Calculation of heat flux as result of cutting forces and an empirical slitting function $N(v_c, t)$
- Transfer results to the workpiece



$$F_c(t) = \int_0^{l_h} R(s,t) dF(K,s,t) ds$$
$$Q(t) = F_c(t) \cdot v_c \cdot N(v_c,h)$$







Workpiece model: Thermomechanical model, FEM



Simulation of thermomechanics of the workpiece

Coupled finite element & dexel models

FEM model for temperature θ

 $\rho c_e \theta_t - div(\kappa \nabla \theta) = 0 \qquad \text{in } \Omega_s(t) \times [0, T], t \ge 0 \\ -\kappa \nabla \theta \cdot \mathbf{n} = q(t, x) \quad \text{on } \Gamma_N(t) \times [0, T]$

and deformation *u*

$$-\mu\Delta \boldsymbol{u} - (\mu + \lambda) \text{grad div } \boldsymbol{u} = \boldsymbol{f} \qquad \text{in } \Omega_s(t), t \ge 0$$
$$\boldsymbol{u} = 0 \qquad \text{on } \Gamma_D(t)$$
$$- \left(\lambda tr(\epsilon(\boldsymbol{u}))I + 2\mu\epsilon(\boldsymbol{u})\right) \cdot \mathbf{n} = \boldsymbol{g}(x, t) \text{ on } \Gamma_N(t)$$

in time dependent subdomain $\Omega_s(t)$ with moving boundary $\Gamma_N(t)$







Approximation of domain



Approximation of time dependent subdomain $\Omega_{s}(t)$ with moving boundary $\Gamma_{N}(t)$

- **Several possiblities:**
 - Moving mesh (ALE approach)
 - Remeshing at every time step
 - XFEM / Cut Cells on a fixed mesh
 - Subset of a fixed (locally refined) mesh

Meshes should later be efficiently usable for an optimization procedure























Approximation of time dependent subdomain $\Omega_{\!_{s}}(t)$ with moving boundary $\Gamma_{\!_{N}}(t)$

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and deformation *u*

$$-\mu\Delta \boldsymbol{u} - (\mu + \lambda) \operatorname{grad} \operatorname{div} \boldsymbol{u} = \boldsymbol{f} \qquad \text{in } \Omega_s(t), t \ge 0$$
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in time dependent subdomain $\Omega_s(t)$ with moving boundary $\Gamma_N(t)$







Approximation of domain Boundary conditions



Approximation of time dependent subdomain $\Omega_{\!_S}(t)$ with moving boundary $\Gamma_{\!_N}(t)$

Quality of approximation?

Look at an elliptic problem

For the **Dirichlet** problem, it is well known that you get P^1 optimal order only when you approximate a curved boundary of **order** h^2 (by interpolation, e.g.).

With **Neumann** boundary data, you might expect to get a better approximation in some cases, but this is not true in general (look at travelling wave solution for heat equation)







Approximation of time dependent subdomain $\Omega_{\!_{S}}(t)$ with moving boundary $\Gamma_{\!_{N}}(t)$

Nevertheless, we use a discrete domain

$$\Omega_h(t) := \{ T \in \mathcal{T}_h : T \cap \Omega(t) \neq \emptyset \}$$

$$\Gamma_h = \partial \Omega_h$$

Approximation can be improved by local mesh refinement near the boundary.









Approximation of time dependent subdomain $\Omega_{\!_S}(t)$ with moving boundary $\Gamma_{\!_N}(t)$

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Continuous problem:

$$(\nabla u, \nabla v)_{\Omega} = Q(v) := \int_{\Gamma} qv \, do \quad \forall v \in X$$

Discrete problem:

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$$(\nabla u_h, \nabla v_h)_{\Omega_h} = Q_h(v_h) := ?$$



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 $\forall v_h \in X_h$



Approximation of domain Boundary conditions



Approximation of time dependent subdomain $\Omega_{\!_S}(t)$ with moving boundary $\Gamma_{\!_N}(t)$

Neumann boundary data: on RHS of weak formulation,

replace $\int_{\Gamma} q(x)v(x)dx$ by $\int_{\Gamma_h} q_h(x)v_h(x)dx$

with suitable modification of flux density, accounting for different length, etc. so that amount of total flux is unchanged Simple idea: use

$$q_h(x_h) := q(x)(\nu(x) \cdot \nu_h(x_h)) \quad x_h \in \Gamma_h, \ x \in \Gamma$$



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Approximation of domain **Boundary conditions**

Ivo Babuška & Jan Chleboun [Math.Comp. 2001]

Idea: choose a vector valued function around $\partial \Omega$

 $\bar{Q} \in H^1_0(B)^d$ with $\bar{Q} \cdot \nu = q$ on $\partial \Omega$

propose a more general approach for







and replace

$$\int_{\partial\Omega} q(x)v(x)dx$$

by

$$\int_{\partial\Omega} v(x) \, d\bar{Q} := \int_{\Omega} \bar{Q} \cdot \nabla v(x) + \operatorname{div} \bar{Q}(x) \, v(x) \, dx$$

This can be used also for the discrete domain,

$$Q_h(v) := \int_{\partial \Omega_h} v(x) \, d\bar{Q}$$

Convergence of solutions and estimates were shown by Babuška&Chleboun.



Approximation of domain Error analysis



Ivo Babuška & Jan Chleboun [Math.Comp. 2001] prove estimates like

$$||\!| u - \tilde{u}_h ||\!|_{\Omega}^2 \le h_{\Gamma} C(|\bar{Q}|_{H^1(\Omega_h)}, |\bar{Q}|_{H^2(\Omega_h)}, ||\nabla \bar{Q}||_{L^{\infty}(\Omega_h \setminus \Omega)})$$

where $\, u \,$, ${ ilde u}_h \,$ are the continuous solutions of the problems

$$\begin{split} & u \in H^1(\Omega): \quad \int_{\Omega} A \nabla u \nabla v + uv \, dx = Q(v) \quad \forall v \in H^1(\Omega) \\ & \tilde{u}_h \in H^1(\Omega_h): \quad \int_{\Omega_h} A \nabla \tilde{u}_h \nabla v + \tilde{u}_h v \, dx = Q_h(v) \quad \forall v \in H^1(\Omega_h) \overset{\Gamma_h}{\longrightarrow} \\ & \text{for Lipschitz domains} \quad \Omega \subset \Omega_h \subset I\!\!R^2 \\ & \text{and} \quad h_{\Gamma} \text{ is the distance between } \Gamma \text{ and } \Gamma_h \end{split}$$





Approximation of domain Error analysis



The error

$$||u-u_h||_{\Omega}$$

can be split into

$$||u - u_h||_{\Omega} \le ||u - \tilde{u}_h||_{\Omega} + ||\tilde{u}_h - u_h||_{\Omega_h}$$

the first term can be estimated via B&C (a-priori) the second term using standard a-priori and a-posteriori estimates

To do: a-posteriori estimate for the first term

Nevertheless, a mesh refinement at the boundary and an adaptive refinement in the domain should give good results.









Use same idea for

(quasi-stationary) thermo-mechanics

with boundary forces on $\Gamma(t)$

time dependent heat equation on time-varying domain





Approximation of domain Numerical experiments



Numerical experiments [Carsten Niebuhr]:

Known exact solution (travelling wave, exponential)









Global and adaptive local refinements -- L ∞ (L²) error







Approximation of domain Numerical experiments



Numerical experiments [Carsten Niebuhr]:

Known exact solution (travelling wave, exponential)







Workpiece model: Thermomechanical model, FEM





Video

Visualization of temperature and deformation on time dependent domain by FEM





Validation: temperature





Material:

– C45EN







Validation: deformation





Material:

– C45EN









Goals: speed of process, quality of final geometry (deviation from prescribed)

Optimal control problem:

Control *u*: variation of cutting process (tool path, rotational speed, ...) **State** $(\theta, \mathbf{v}, \Omega)$: temperature, deformation, and time dependent domain

$$\begin{pmatrix} \dot{\theta}(t) \\ 0 \end{pmatrix} + \begin{pmatrix} A(t) & 0 \\ 0 & S(t) \end{pmatrix} \begin{pmatrix} \theta(t) \\ \mathbf{v}(t) \end{pmatrix} = F(\theta(t), \mathbf{v}(t), u(t))$$

Boundary data, heat source q and force g in F, and $\Omega(t)$ depend on cutting process (control u) and deformation **v**

Here, $\Omega(t)$ is reference domain, decreasing by material removal







Optimal control problem:

Goals: speed of process, quality of final geometry (deviation from prescribed) **Control** *u*: variation of cutting process (tool path, rotational speed, ...) **State** (θ , **v**, Ω): temperature, deformation, and time dependent domain

$$\begin{split} \dot{\theta} - \nabla \cdot (\kappa \nabla \theta) &= 0 & \text{in } \Omega(t) \\ \kappa \nabla \theta \cdot \mathbf{n} &= \underline{q}_{\Gamma}(u, \theta, \mathbf{v}) + r(\theta_{ext} - \theta) & \text{on } \partial \Omega(t) \\ -\nabla \cdot \sigma &= f_{v}(\theta) & \text{in } \Omega(t) & \text{elliptic} \\ \sigma &= 2\mu D \mathbf{v} + \lambda tr(D \mathbf{v}) \mathbb{I} & \text{on } \Gamma_{D} \\ \mathbf{v} &= 0 & \text{on } \Omega(t) \setminus \Gamma_{D} \end{split}$$

 $\Omega(t)$ depends on cutting process (control *u*) and deformation **v**

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Engineering approach: [Daniel Niederwestberg, PhD thesis 2016]

- Error prediction inside the process model
- Compensation by local variation of tool engagement by inverse deformation





Compensation of distortions: Validation: Error in form and dimension



Without compensation

Simulation

Measurement







Compensation of distortions: Validation: Error in form and dimension



With compensation

Simulation

Measurement



Reduction of shape error by 70%





Optimization of milling processes Reduced model problem



Reduced reference workpiece (L-shape)









Optimization of process parameters

"Full" optimization approach with computation of primal/dual solutions might be possible, but computationally very challenging.

Simpler approach: "Simulation-based Optimization"

Replace control-to-error function by a simple approximation computed due to a small number of simulations,

refine the approximation locally (near the optimum)

by adding a few more simulations

Joint work with Jonathan Montalvo-Urquizo and Maria G Villarreal-Marroquin (CIMAT / MOCT, Monterrey, MX)









"Simulation-based Optimization"

Control: Tool path variation

and other cutting parameters Goals: **multi-objective**,

minimize shape error, tool wear rate











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"Simulation-based Optimization"









"Simulation-based Optimization"



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