

Automated Industrial PTFE Billet Sintering Temperature Profile Optimization for Residual Stress Reduction

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Abstract: Because of its high viscosity in melted state, PTFE powder is typically sintered first as large billet, from which parts are machined such as films, seals, etc. In large industrial sinter billets that can reach beyond 1-2 meters in size, PTFE's low thermal conductivity and large crystallization volume change could introduce significant residual stress during cool down from sinter temperature, resulting in billet cracking and difficulties in the subsequent machining step. FEA models were developed to predict the residual stress in the billet for a given temperature profile. The model was driven by iSight to minimize the cool down stage of the profile for minimal residual stress. Several optimization algorithms were compared. Entirely automated optimization workflows were then encapsulated into iSight components, with input/output exposed to end users as Excel spreadsheets. The components were then published to Simulia Execution Engine (SEE) via WebTop for remote execution. The capabilities of encapsulating simulation into "black-box" allowed the penetration of analysis into front-line design/processing engineers' daily activities through dramatically reduced operation cost and improved availability.

Keywords: PTFE, Sinter, Optimization, iSight, Simulia Execution Engine, Webtop, Residual Stress

1. Introduction

The design and control of temperature profile – temperature vs time history – is one of the fundamental elements in a wide range of material fabrication process developments, such as in glasses, polymers, crystals, etc. Among other concerns, the accumulation of internal stress during the cooling down and the residual stress upon the process completion are main motivations for profile design. The internal stress has to be controlled within limits to avoid failure or unacceptable deformation. Furthermore, even with visually acceptable processed parts, the residual stress could still be large enough to negatively impact downstream manufacturing process such as film skiving or part machining. In this effort, we are concerned with the optimization of temperature profile of industrial PTFE billet sintering for the purpose of residual stress minimization. We then summarize the approach to implement the optimization and simulation into the processing engineer's workflow through simulation automation.

1.1 Residual stress in PTFE billet

Because of its unique mechanical and chemical properties -- such as low friction coefficient, excellent chemical resistance, and thermal-mechanical stability -- PTFE has been widely used in films, bearings, seals, and other industries. Due to the high viscosity in melted state, billet sintering is the common first step in manufacturing PTFE parts (Drobny 2009). An example is shown in Figure 1. The PTFE powder is first pre-conditioned and molded into billets under given pressure. The de-molded green billet already has enough rigidity for handling and light machining. A wide range of billet sizes are used in production, from less than 0.1 to more than 1 meter in either length or diameter. The billets are then stored in temperature and humidity controlled environment for several hours to days to allow complete degassing and relaxation. The billets are placed in ovens and go through a sintering cycle of heat treatment (Ebnesajjad 2000). Once above its melting temperature of around 340 °C, PTFE powder particles start to coalesce and eventually form homogenous solid body with little porosity (Narkis 1995). The sintering temperature is typically controlled between 360 °C to 370 °C depending on the powder and process needs, a trade-off between sinter time and chemical stability.

The temperature profile is carefully controlled throughout the sintering cycle. An example is shown in Figure 2. As in any temperature cycle, the profile can be divided to three stages: heat up, sinter (constant temperature soaking), and cool down. At sintering temperature, the material is still in semi-solid state, but possesses sufficient energy for molecular to migrate into adjacent volume. The driving force for the sintering of all materials is the reduction of free surface energy (Mazur 1995). Nevertheless, the material transportation in polymer sintering is delivered through visco-elastic/visco-plastic flow (Mazur 1995, Lin 2001), which is different from that of ceramic sintering by mass diffusion (Skorokhod 1961).

One or two temperature holdings are typically inserted into heat up and cool down stages, at temperatures close to PTFE's melting and crystallization temperatures around 300-330 °C. The temperature ramp rate design considers, among other constraints, the allowable temperature gradients, degassing, capability of oven, influence on crystallinity, and accumulation of internal residual stress (Ebnesajjad 2000, Radhakrishnan 1986). A temperature profile is described by a list of (time, temperature) coordinates at control points with linear ramping in between.

Internal stress inevitably occurs during the cool down stage, some of which could persist as the residual stress after temperature gradients disappears. When residual stress becomes severe, cracks are observed on the surfaces of billet. While other causes, such as inclusion, green body density gradient, and degassing, also play important role, the residual stress nevertheless is the force that drives these defects into cracks. Even without cracking, the residual stress impacts the quality of downstream manufacturing procedures. For instance, the curvature and cracking of film skived from the billet is directly related to the residual stresses. The dimensional precision of machined seals cannot be achieved at the presence of large residual stresses.

The cause of residual stress, if ignoring material defects, is the inhomogeneous temperature field inside the billet throughout the sintering cycle (Struik 1990). The temperature gradients result in differential contraction/expansion as well as differential material property evaluation. The residual stress is particularly pronounced in large scale industrial production PTFE billet due to the size (> 1 meter).

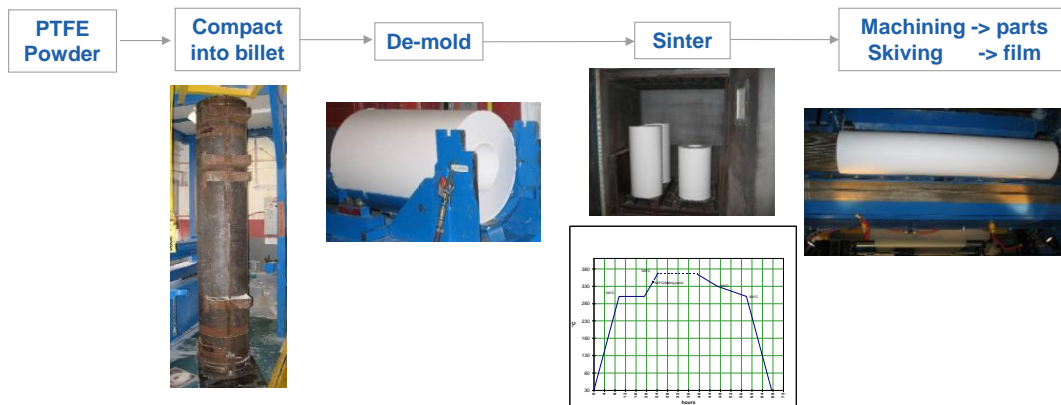


Figure 1. PTFE manufacturing process workflow

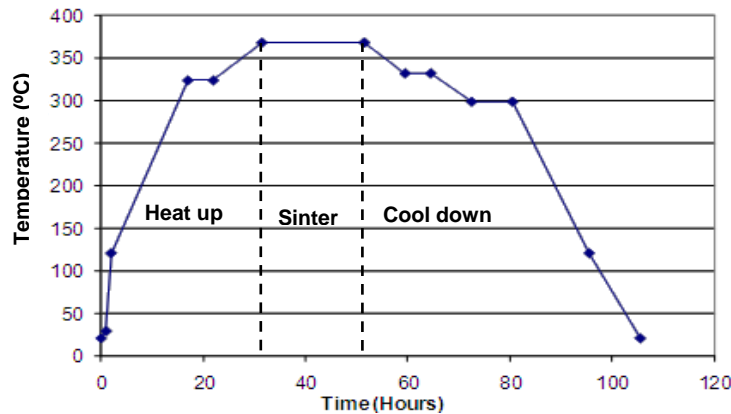


Figure 2. An example of PTFE sintering temperature profile

Industrial manufacturing process designs have traditionally relied on empirical trial-and-error with limited utilization of engineering calculation. Although specific material, shape, size, and oven necessitate specific temperature profile, it is not uncommon to see only a few profiles are used for all conditions, with small empirical adjustments when problems occur. The adjustments are ad-hoc, costly, and time consuming. More importantly, they are in responses to specific incident whose resolution might not ensure against similar problem in future for other materials, size, etc. The difficulties are even more pronounced when facing quality (less stress) vs. cost (less time) trade-off.

With the understanding of material behavior and constitutive models, it is relatively easy now to simulate a particular manufacturing process and predict the residual stresses under a given scenario. Nevertheless, the design of optimal profiles require the solving of the reverse problem through the optimization.

1.2 The critical role of automated simulation and optimization

A conventional optimization relies on the Design of Experiments (DOE) by Finite Element Analysis (FEA) simulation over the entire feasible space. The optimization is done on the approximated response surfaces from the DOE. The workflow is only suitable if the simulation runs very fast, and the feasible space is fairly simple. For complex problems or time consuming simulations, the cost of DOE is prohibitive. In an optimization-driven simulation workflow, the optimization algorithm drives FEA simulation in real time through the analysis of previous simulation results.

The wide industrial implementation of optimization-driven simulation has been held back, not by technology, but by the practicality and cost -- We would argue that similar reasons have also limited the wide spread use of simulation in many smaller businesses, who see CAE as expensive and ad-hoc activities, rather than core competence. We perceive the key obstacles to great impact under limited resource allocation are:

a). ***Operation cost***: When used in daily engineering workflow, the cost associated with FEA analysts who execute the simulation could exceed the cost of the model development itself. The general training of all engineers in FEA is even more costly. Hence, *we often see simulation targeted towards high value troubleshooting rather than as ingredient of routine design workflow.*

b). ***Availability***: FEA analysts and application engineers might belong to different departments at different locations. *The long turn-around time cannot keep up with engineer's rapid iteration cycle and forces them fall back to empirical experiences.*

The solution is provided by simulation workflow automation and encapsulation, and remote execution – the functionalities provided by iSight, SIMULIA Execution Engine, and WebTop. As little programming is needed, any FEA analyst can effectively provide the solution via small extra up-front development cost.

In this paper, we describe one of the efforts by Saint-Gobain Research (Northboro, MA, US and Shanghai, China) to implement the automated, low operation cost, and highly available simulation and optimization tools. We encapsulated the PTFE billet sintering residual stress model in iSight components, which were driven by optimization component. Together, they were entirely automated and published to SEE and via Webtop for remote execution, with simple Excel spreadsheets as the input and output interfaces to end users.

2. Residual Stress Calculation Model

In this exercise, we focus on the residual stresses that are primarily generated during the cool down stage. The heat up and sinter stage of temperature profiles are kept unchanged. We also

assume that the green body from powder compacting and degassing has homogenous density and no internal defects.

2.1 Mechanical Properties

The PTFE green body post-compacting is highly dense with typically just a few percent of porosity. Therefore, the elastic properties of green body are assumed to be the same as sintered PTFE. The Young's modulus is taken from literature (Andena 2004) as a function of temperature (Figure 3), and Poisson's ratio is assumed 0.35 constant.

The model assumes a stress free condition at the end of sinter stage which relieves the need for an accurate model for heat up and sinter stages. The assumption is derived from the polymer sintering mechanism of visco-plastic flow, which fully relaxes any prior stress over the long high temperature soaking (Andena 2004, Narkis 1995). Consequently, we utilize idealized constitutive models during heat up and sinter stage: The green body is considered as linear elastic during the heat up stage; Once above melt temperature of 355 °C, a very low artificial yielding stress is activated for perfect plastic flow. The low yielding stress persists into the cool down stage until the temperature reaches into crystallization temperature between 298 °C and 330 °C, during which the yielding stress increases with lower temperature. Once below 298 °C, the literature value of yielding stress (Andena 2004) (Figure 3) is used with elasto-perfect plasticity model. Current model ignores the hardening and relaxation. Nevertheless, the large production billet has temperature ramp rate on the order of 10 °C/hour or less, which is very slow compared to PTFE relaxation time of <30 minutes at RT and less than a few minutes at high temperatures (Bergstrom 2005). Therefore the material can be approximated by its fully relaxed state, and described by elasto-perfect plasticity. A full visco-plastic model is currently under development to improve the accuracy (Bergstrom 2005).

Beside the thermal expansion, PTFE experiences intrinsic volume change during melting, sintering, and crystallization. While resulted from different physics, all volume changes are quantified by pseudo-thermal expansion coefficients that were measured in-house Figure 4.

Small billets of PTFE powder were compacted at the same compacting pressure experienced by production billets at room temperature and 50% humidity. The billets had diameter of 6mm, and lengths of 6mm and 8mm, respectively. The pressure was maintained for at least 15 minutes before ramping down. The billets were sintering in-situ in a dilatometer following a simple temperature profile of 5 °C/minute heating and cooling rate, and a sinter soak time of 4 hours at 370 °C. The dimensional changes vs. temperature data were recorded by the dilatometer, both in billet axial and radial directions. The two separate measurements are important as the powder compact could introduce anisotropy in the billet. Indeed, the two curves are quite different. No significant difference was found for the two billet aspect ratios at the compacting pressure used (> 30 MPa). Similar tests were also repeated in DMA and TMA machines to cross check the results. DMA/TMA has the advantage of much smaller probe head forces that are less likely to indent the sample surface and distort the results. At smaller compacting pressure, differences could be seen from DMA/TMA data compared with dilatometer, also between billets of different aspect ratios.

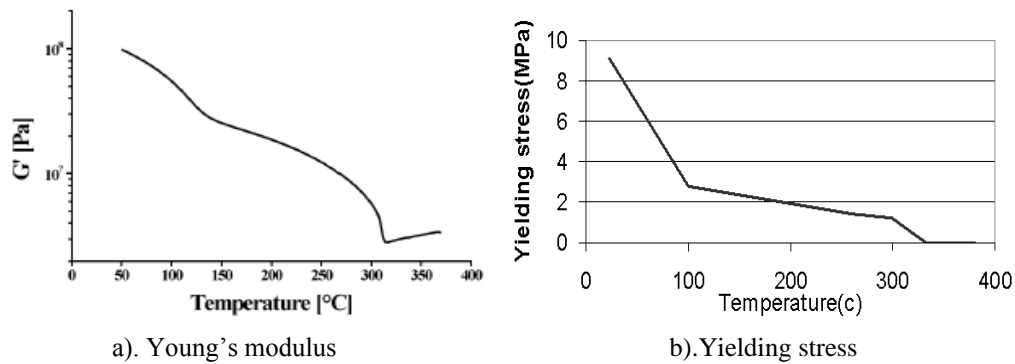


Figure 3. Young's modulus and yielding stress of PTFE (Andena 2004)

The pseudo-thermal expansion (as total thermal expansion with reference temperature at 25 °C) is shown in Figure 4 for axial and radial directions respectively. Evidently, the volume changes associated with melting and crystallization entirely dominate the deformation and are the main causes for residual stresses.

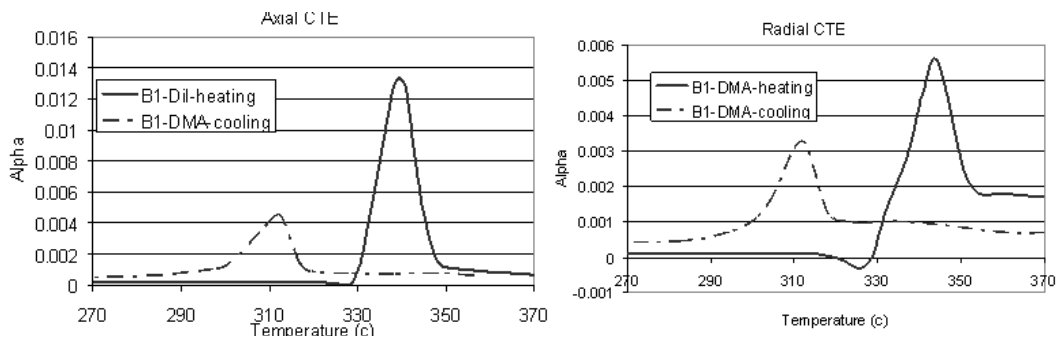


Figure 4. Pseudo-thermal expansion coeff. in billet axial and radial directions

2.2 Thermal Properties

The temperature dependent thermal conductivity is taken from literature (Andena 2004) as:

$$k(T) = a + bT; \quad a = 0.255 \text{ W/mK}, b = 4.85 \times 10^{-4} \text{ W/mK}^2 \quad (1)$$

The specific heat was measured by DSC in house, plotted in Figure 5. Together with the volume change data, we can determinate that the specific PTFE powder starts to sinter at above 355°C and crystallizes between 298°C and 320°C.

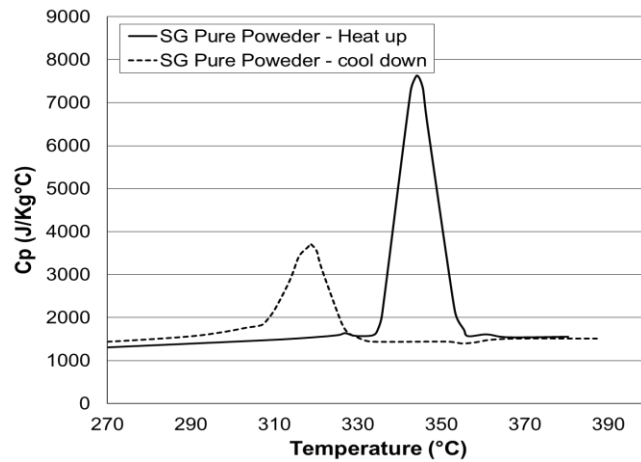


Figure 5. The specific heat of PTFE

2.3 FEA Model

A fully-coupled thermo-mechanical Abaqus model was constructed taking advantage of the axi-symmetric nature of the billet, shown in Figure 6.

The industrial sinter ovens are specifically designed to maximize the temperature uniformity by, for example, forced air circulation, rotation and spatial motion of billets, etc. Meanwhile, the temperature ramp rate is slow. Hence, we can assume uniform air temperature on billet surfaces that closely follows the oven set temperature. Heat exchange coefficients of $H=40 \text{ W}/(\text{m}^2\text{K})$ and $H=20 \text{ W}/(\text{m}^2\text{K})$ are applied on the external and internal surfaces of the billet, respectively. A parametric study has shown that results are insensitive to the H values as the internal heat resistance dominates. The billet sits on a steel plate with open holes for air flow, which is modeled as an imposed temperature directly on billet surface. A reference temperature profile shown in Figure 2 is used as a baseline and the starting point of optimization. An example of residual stress contour (Von Mises stress) is plotted in Figure 6 with high stress in red and low stress in blue. The location of maximum stress at the middle of billet and on surface is in agreement with the location of typical cracks. The maximum stress over the entire model at the end of thermal cycle is extracted as the optimization objective.

3. Temperature profile optimization

While the temperature profile can take any shape, we practically constrain the cool down stage of curve in Figure 2 to six linear segments. Each segment is defined by its start and end control points at respective locations in the temperature vs. time coordinate. Since this effort only targets the cool down stage (heat up and sinter stages fixed), the first control point in the cool down stage has fixed temperature coordinate which is the sinter temperature. The optimization is decoupled into two parts: sinter time optimization and cool down profile optimization.

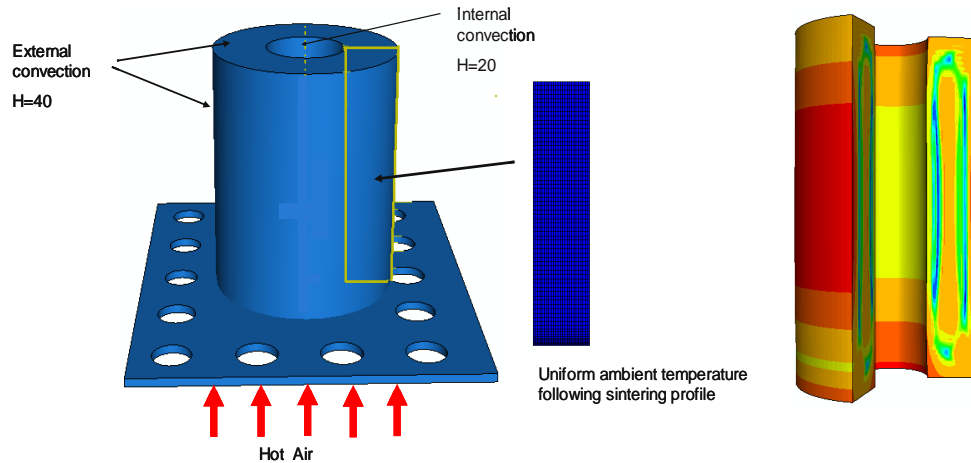


Figure 6. Thermo-mechanical model and residual stress contour

Sinter time optimization minimizes the sinter stage duration under the following condition: any point in the billet should have been exposed to a temperature above given sintering temperature (for example 370 °C) for at least given duration (for example 2 hrs). This is to ensure the completion of particle coalescence before the cool down commences (Hambir 1994).

Cool down profile optimization seeks the locations of remaining control points that minimize the residual stress. The last point is fixed at room temperature, but with a constraint of the total cycle time being either fixed or flexible but less than the allowed maximum, specified by user. Furthermore, we also enforce two constant temperature holdings, the length of which could be minimal to represent the situation of no temperature hold. In total, there are 9 independent design variables (or 8 if total cycle time is fixed).

Plenty theoretical treatments on residual stress can be found in the literature (Struik 1990) that provide insights to the mechanism. In a purely elastic body, no stress would persist when temperature gradient inside the body disappears. Any residual stress is the consequence of spatially *differential* plastic strain in the body. Hence, by tracing the evolution of plastic strain, one can estimate the impact of temperature profile on residual stress. Based on this understanding, a manual optimization was first attempted through limited DOE of 1-2 variables at a time, ignoring the interaction between design variables. The results are compared later with these from the optimization algorithms.

3.1 Workflow automation and optimization by iSight

The residual stress calculation procedure was first encapsulated into a component published to SEE component database. The simple component calculates maximum residual stress in the billet for a given temperature profile, billet dimension, and other operation conditions, all of

which are exposed as the component's input and output parameters. The modular structure ensures the continued refinement of FEA model can be conducted without influencing the optimization workflow. Logic was built into the component to skip the actual Abaqus execution if the temperature profile is not valid (for example, not monotonically increasing or decreasing) to save unnecessary computation. The execution time for the component is typically 5-10 minutes.

The complete optimization workflow is shown in Figure 7, which is composed of the following blocks as labeled in the figure: A) The inputs are first read from an Excel file, which end users fill in as a request. The key inputs include a reference temperature profile, billet dimensions, sintering condition (sinter temperature, sinter time). Also as inputs are parameters for optimization algorithms: the maximum cycle time, whether to minimize residual stress only for the given cycle time, or both residual stress and total cycle time with specified relative weights; B) The residual stress from the reference temperature profile is first calculated; C) the actual optimization is carried out, which will be discussed below; and D) the optimized profile and minimized residual stress are saved in an Excel file and emailed to the end users automatically.

The optimization workflow consists of two optimizations component, labeled as C-1 and C-2, respectively in Figure 7:

C-1 -- sinter time optimization: The design variable is the time coordinate of the first control point in the cool down stage (Figure 2), the minimization of which is also the objective function. The minimal temperature was obtained (as an output of residual stress calculation component) at a specified time (sinter time) before this time coordinate, which is constrained to be above a specified temperature (sinter temperature). The gradient based MMFD algorithm is used for this simple problem, which typically converges in less than 10-20 iterations.

C-2 – cool down profile optimization: The multi-variable, multi-objective, and highly non-linear optimization contains 9 design variables of the temperature-time coordinates of control points in Figure 2 cool down stage. Only monotonically decreasing temperature vs. time is meaningful, and should be a constraint. In constrained optimization, however, the infeasible design points are still evaluated only with high penalty – which results in enormous wasted iterations. Henceforth, the increments in temperature and time between these control points are taken as the design variables instead, naturally enforcing the monotonic condition. Consequently, the only constraint remains as the time coordinate of the last control point should be less than the maximum allowed value. The optimization component has the option of turning on/off individual constraint/objective based on Boolean parameter. The feature is utilized to switch the optimization workflow between single objective – residual stress, and two objectives – residual stress and cycle time. In the latter case, the relative weights of the two objectives are exposed as inputs specified by user (for example, 1 hour cycle time ~ 0.1 MPa residual stress).

The complexity of the problem is not suitable for any gradient based optimization algorithms, esp. the likelihood of numerous local minimal; and the relatively long evaluation time of each design point precludes the usage of genetic algorithm based methods. The effectiveness of four exploratory direct methods type of algorithms is compared: Evol, DownhillSimplex, Hooke-Jeeves, and Pointer. The DownhillSimplex was found to achieve the best balance between the convergence speed and ability of escaping local minimal.

An example of optimization results is shown in Figure 8. In the plot, the cool down stage of the reference profile, the result from manual optimization, and the result from iSight optimization are compared, together with their respective residual stresses. While the (costly)

behaviors. Hooke-Jeeves is easily trapped in local minimal, and has difficulty in progressing into correct direction. Evol, being an evolution algorithm, explores widely in the design space and does not present a trend of convergence. In contrast, DownhillSimplex quickly establishes a path towards minimal and quickly converges. Finally, as a combination of different algorithms, Pointer often can often achieve better results than any individual algorithm as testified by the results. The drawback of Pointer is the possible slow convergence (not the case in Figure 9) and the fact that it cannot yet be executed in parallel.

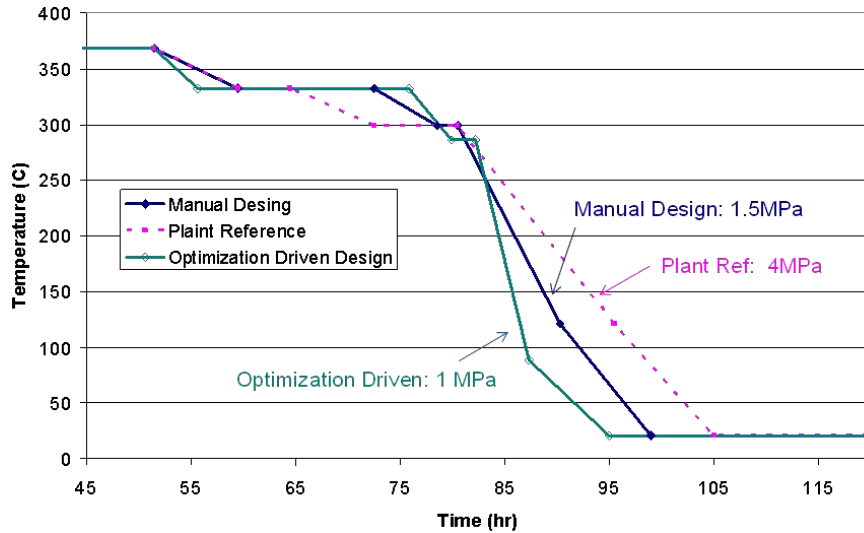


Figure 8. Optimized sinter profiles (cool down stage) and residual stresses: comparison between reference, manual optimization, and iSight optimization

The iteration histories of the Pointer and DownhillSimplex algorithms in the case of multi-objective optimization of both residual stress and cycle time are plotted in Figure 10. Unlike in previous case, DownhillSimplex performs better both in term of reaching better results and convergence speed. Although it is very possible that given enough iterations, Pointer will eventually reach a better solution, DownhillSimplex nevertheless achieves a good balance between performance and cost. It should be noted that DownhillSimplex explores local area around previous design points. Therefore, the initial location at which optimization starts is important in influencing its performance, while it might not be as critical for Pointer or Evol.

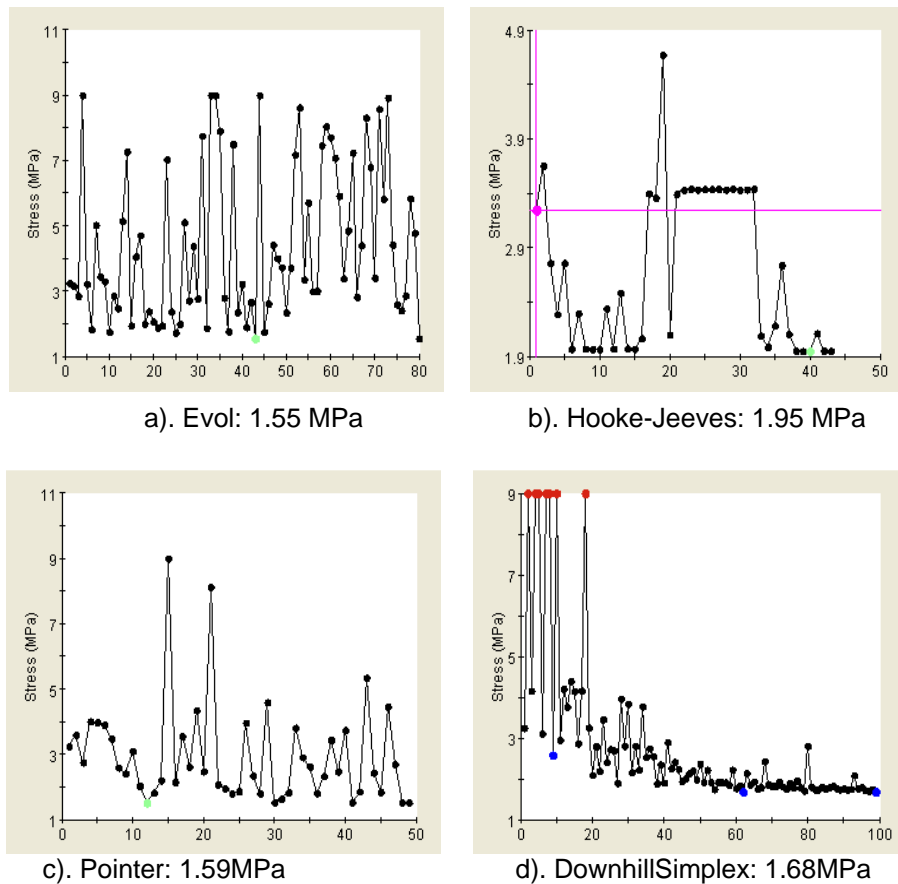


Figure 9. Iteration history of different algorithms and residual stress achieved for single objective optimization with fixed cycle time

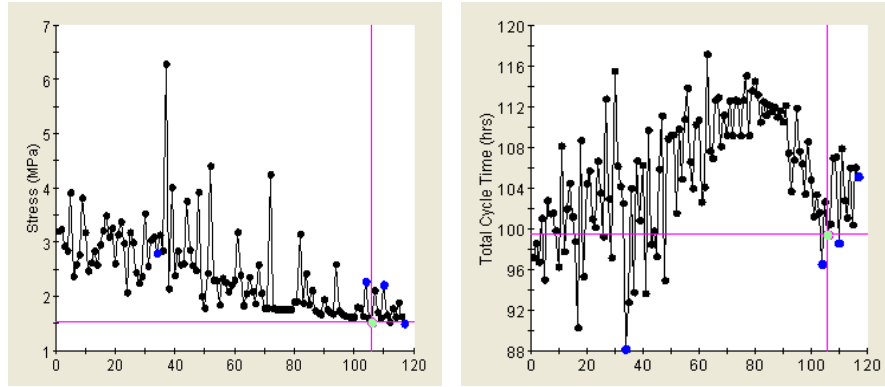
3.3 Low operation cost and high availability

As we have elaborated previously, the barriers to the wide implementation of simulation are the operation cost and availability; where the availability could mean both access from any geographic location and at any time on demand.

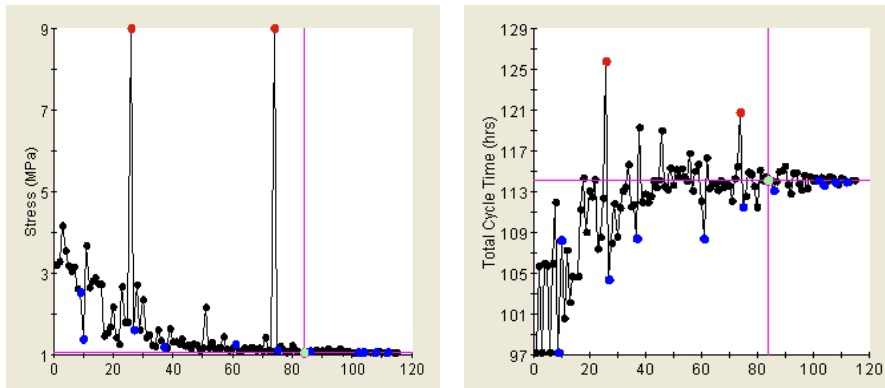
We have seen that iSight has helped to dramatically reduce the costs of simulation workflow development and operation. The knowledge of analysts is captured in the encapsulated workflow and custom component.

The deployment of SEE platform and WebTop addressed the availability issue, especially for businesses whose engineering teams are not centrally located, or do not have sufficient dedicated FEA analysts resources. The WebTop presents any iSight component published to SEE component database to webpage interface that can be executed through standard internet browser.

The ability of maintaining and hosting simulation in a central location, accessible through the web browser sidestepped the cost of software deployment, maintenance, and user training.



a). Pointer: best objective function = 2.5 (Stress=1.5MPa, Cycle time=88 hrs)



b). DownhillSimplex: best objective function = 2.2 (Stress=1.1MPa, Cycle time=97 hrs)

Figure 10. Iteration history comparison between Pointer and DownhillSimplex in multi-objective optimization

In this case, the sinter profile optimization workflow was published as a WebTop application, hosted in corporate central R&D's computation resource. The WebTop interface seen by end user in a browser is shown in Figure 11. End users, through the corporate intranet, download the template Excel file to fill in request, which is uploaded in the same webpage as the input file for the optimization component, and the job is submitted to the central server. The optimization results are automatically emailed to the user upon finish.

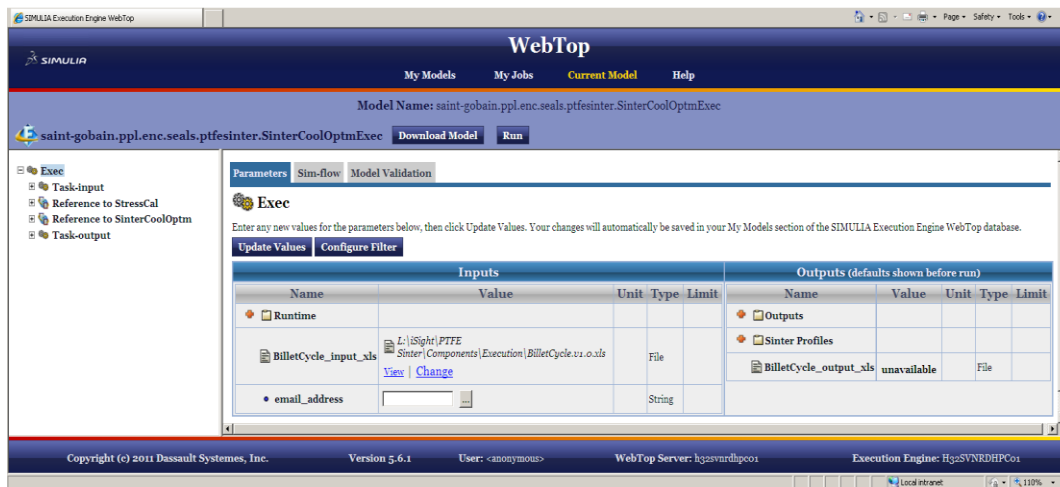


Figure 11. WebTop interface for the sinter cycle optimization

4. Final Thoughts

Advanced simulation techniques and solving large scale complex problems have always captured excitement and attention within simulation community. However, the penetration of simulation as everyday design tools has not seen the success it deserves in small/medium companies or small/medium business units within large corporations. On the other hand, plenty of product development could easily benefit from matured simulation technique and small scale effort. The key obstacles are still the operation cost of executing already developed simulation in routine design work; and the availability of the simulation tool for fast product development and to geographically scattered engineering teams. The built-in simulation tools in many CAD software, while low cost and readily available, are limited in their capability. Experienced analysts' scientific knowledge, skills, and judgment cannot be substituted by FEA software in foreseeable future. One such example is in material manufacturing industrial such as of Saint-Gobain Innovative Materials, where many problems involve complex material constitutive behavior, contact, coupled physics, etc., for which the cost of simulation model development could not be sidestepped.

However, the advancement in software can help tremendously in reducing the operation cost of simulation model in production, and availability of which – a close analogy to turning a laboratory process into mass production. Caution should always be taken on the validity of model output and the intelligent understanding of their meaning. With upfront effort in development phase, checks built-in to workflow, and only applying to appropriate problems, we believe that the approach of automation, encapsulation, and remote execution is one of the keys to the wide spread of advanced simulation into industrial deployment at the individual engineer's level.

In this effort, we have demonstrated the aforementioned approach in optimizing the billet sintering temperature profile for residual stress reduction. The optimization algorithm in iSight

drives an Abaqus workflow that calculates post sintering residual stress of PTFE billet for a given temperature profile. The optimization and simulation workflow are entirely automated and encapsulated into iSight components published to SEE, with simple Excel file as the input/output interfaces. The workflow is then published by WebTop to intranet, and allows remote execution from anywhere and anytime. Within the predefined design scope, an engineer can conduct a temperature profile optimization for specific application without incurring any cost other than computer run time.

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