

# PAPER NUMBER: 1853

# **Composites Manufacturing and Processing - Session 2**

# PREDICTION OF PROCESS-INDUCED DEFORMATIONS USING DEEP LEARNING INTERFACED FINITE ELEMENT CONSTITUTIVE MODELS

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23<sup>rd</sup> International Conference on Composite Materials Belfast, 31st July- 4th August 2023





# **Problem Description:**



Process induced defects arises due to:

- Thermal expansion
- Chemical shrinkage
- Lay-up configuration, mold material, composite part thickness etc.,



The cure state variables are

- The degree of cure, X
- The glass transition temperature,  $T_g$

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# Non-parametric cure model:



Characterization tests at rates of 1.5°C/min, 0.55°C/min, and 0.5°C/min & with isothermal dwells at 180°C, 175°C, and 185°C, respectively + some

with partial curing

Diffusion Cure Kinetics (CK) Model (Cole, et al. [2005]) and DiBenedetto's model (Stutz, et al. [1990])

$$\left(\frac{\mathrm{dX}}{\mathrm{dt}},\mathrm{T}_{\mathrm{g}}\right) = \mathrm{f}(\mathrm{X},\mathrm{T})$$

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## Drawbacks:

- No dependency on process condition variables.
- The part often follows different temperature profile.
- CK model parameters treated deterministically.



Non-parametric neural network model

= f(X, T, r) $\frac{1}{dt}$ , Tg

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# Case study: Curing of Z-shaped part $([\pm 45^{\circ}/0.90^{\circ}]_{4s})$ made of 15 plies on Invar mold





• Validation of the internal residual stress field is achieved through a comparison of process induced deformations (PIDs).

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# **Summary and Conclusions:**

- The non-parametric model makes accurate state transitions predictions considering the influence of process conditions.
- The proposed model when interfaced with the constitutive model predicts the PIDs that correlates more closely with experimental laser scan measures for the case of Z-shape thermoset part.

# **Outlooks:**

- The model is implemented to conduct stochastic curing simulations, allowing for the quantification of uncertainties associated with cure temperature cycles.
- Characterization of complex resin formulations for newer thermoset materials.

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