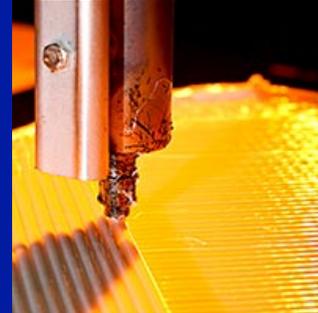


Peter Olmsted  
Georgetown University

## Roadmapping Workshop: Measurement Science for Polymer- Based Additive Manufacturing



<http://www.staticwhich.co.uk/media/images/in-content/makerbot-replicator-2-brick-print-failure-323301.jpg>



<http://web.ornl.gov/sci/manufacturing/research/additive/>

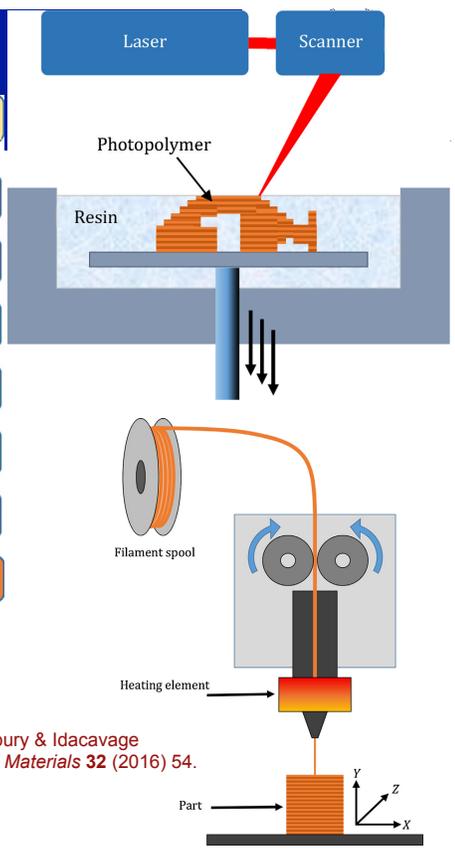
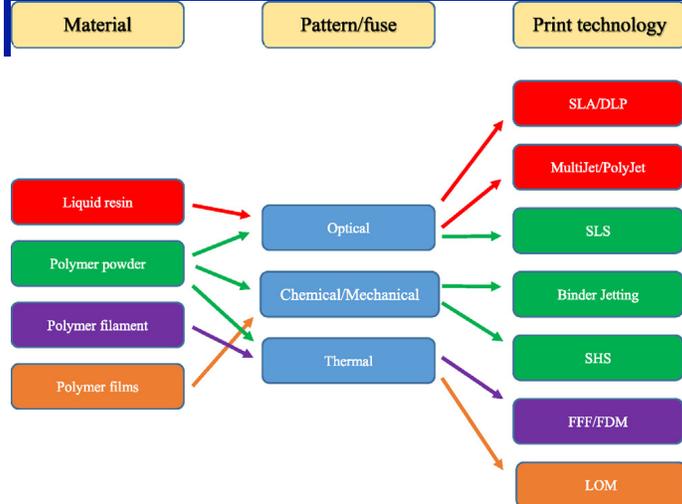
## Challenges in AM Processing



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- Slow ?
- Limited combinations of materials
- Processing conditions vs materials properties
- Temperature monitor and control [non-isothermal!]
- Non-equilibrium phenomena
- Marriage of thermal and materials properties
- Mechanics, shrinkage, and morphology
- How to optimize and design shapes of materials
- Desperate need for standards!

# Some polymer methods..



Stansbury & Idacavage  
*Dental Materials* 32 (2016) 54.

**Table 1 – Polymer-based additive manufacturing (AM) acronyms.**

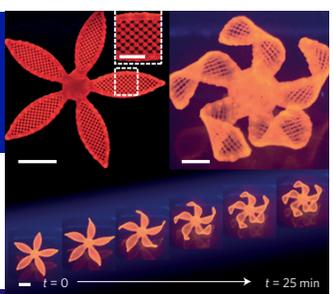
SLA	Stereolithography apparatus
DLP	Digital light projection
CLIP	Continuous liquid interface production
SLS	Selective laser sintering
SHS	Selective heat sintering
BAAM	Big area additive manufacturing
FFF/FDM	Fused filament fabrication/fused deposition modeling
LOM	Laminated object manufacturing

## 4D Printing = space + time

nature materials

LETTERS

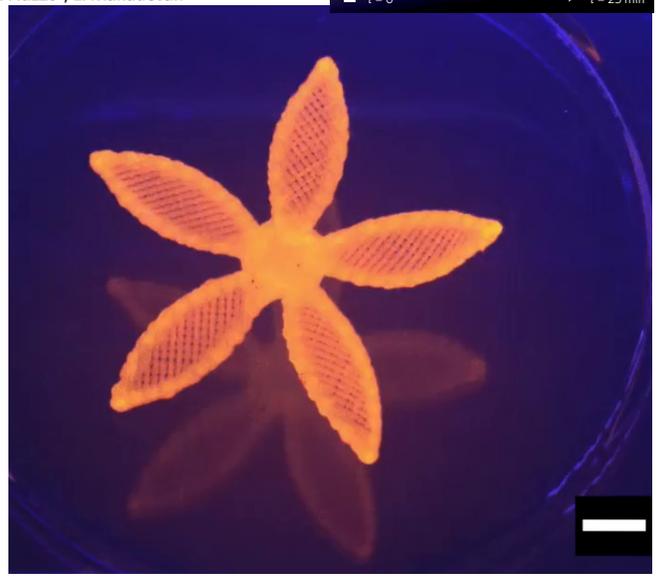
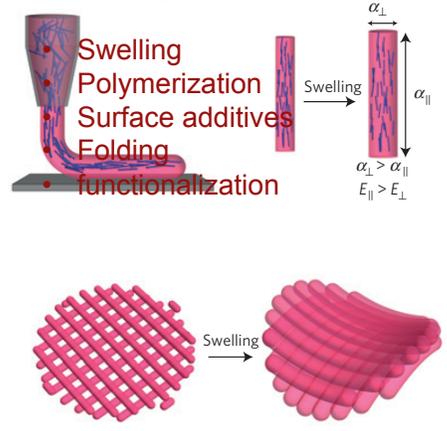
PUBLISHED ONLINE: 25 JANUARY 2016 | DOI: 10.1038/NMAT4544



### Biomimetic 4D printing

A. Sydney Gladman<sup>1,2†</sup>, Elisabetta A. Matsumoto<sup>1,2†</sup>, Ralph G. Nuzzo<sup>3</sup>, L. Mahadevan<sup>1,2,4\*</sup> and Jennifer A. Lewis<sup>1,2\*</sup>

“time” = post-processing



# Fused Deposition [Filament] Modelling of Polymers (FDM, FFD, FFF)



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- “Hot Glue Gun” Extrusion
- Molten polymers: glassy or semi-crystalline
- Non-isothermal process..
- Rapid prototyping
- Poor mechanical properties?
- Great potential to expand to biopolymers, medical devices, mechanically strong materials, ....?

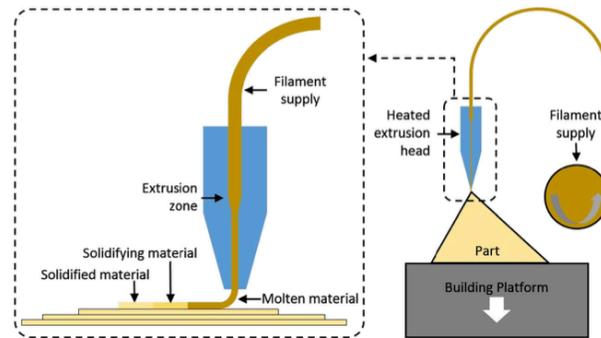
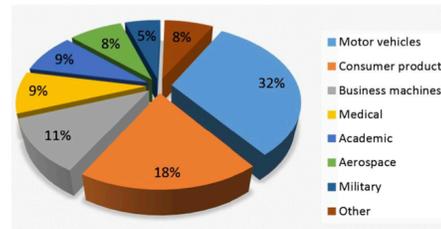


Fig. 3 Rapid prototyping worldwide 2001 [7]

Kruth J.P, Levy G, Klocke F, Childs THC (2007) Consolidation phenomena in laser and powder-bed based layered manufacturing. CIRP Ann Manuf Technol 56(2):730-759

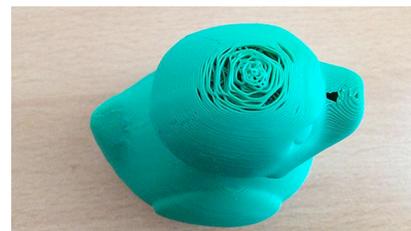


## Some Challenges in Polymer FDM



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- Weak mechanical properties
- Sagging
- Poor/textured surface properties
- Porosity
- Shrinkage, warping, and debonding.



## Material

## Transition Temperature

- Semi-crystalline polymers
  - poly-caprolactate (PCL) [biodegradable polyester]
  - polylactic acid (PLA) [biodegradable]
- Amorphous polymers
  - Polycarbonate (PC)
  - ABS: Acrylonitrile-butadiene-styrene (copolymers + rubber particles)

- Melt: 60 C
- Melt: 150-160 C
- Glass: 147 C
- Glass: 80-125 C

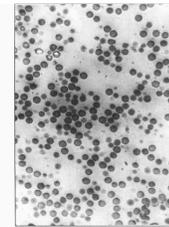
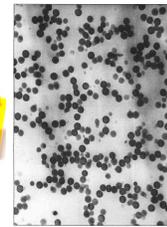
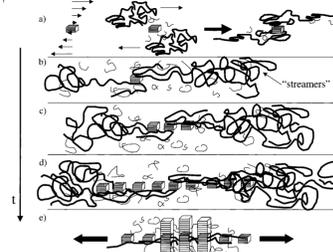
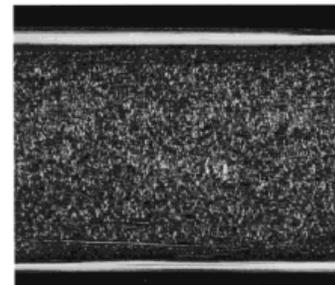
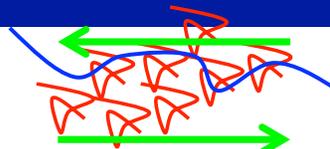


Photo 2: ABS 1 - GD = 29%

Photo 3: ABS 3 - GD = 63%

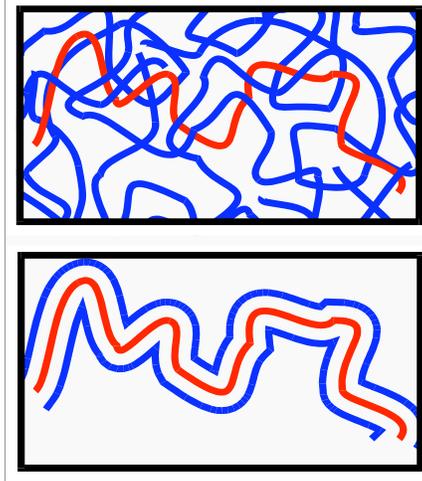
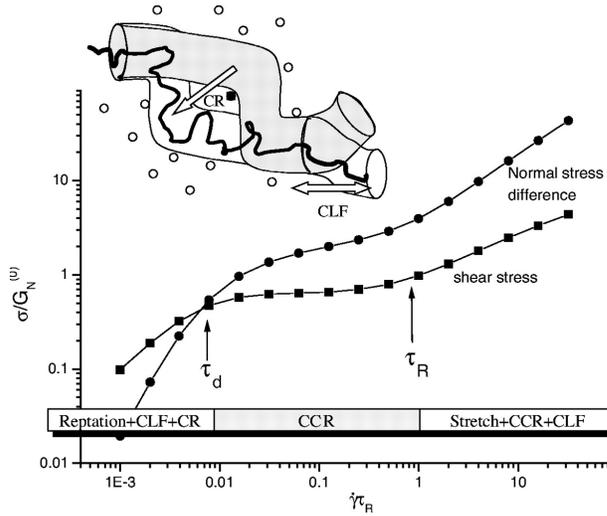
## Relevant Polymer Physics

- Crystallization
  - Exothermic, structure formation, flow-induced,
- Molecular orientation in flow
  - Alignment influences welding, deposition
- Rheology of entangled polymers
  - Non-Newtonian, non-linear, . . . .
- Entanglement and diffusion
  - Controls weld process
- Glass transition
  - Ideally want sharper liquefaction above  $T_g$  (fragile glass)



[PLLA (Grade 4043D, Mw=111kg/mole, Z=12 Entanglements)]

# Entangled Polymer Dynamics



Rouse ('Stretch')  $\tau_R \approx N^2$   
 Reptation ('disengagement')  $\tau_d \approx N^3$

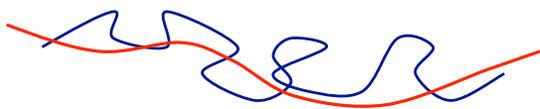
Viscosity  $\eta \sim N^3$

[Doi & Edwards, Faraday Discussions II (1978-1979) ]

# Polymer Dynamics and Timescales: "Weissenberg numbers"



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$$Wi_{\text{rept}} = \tau_d \dot{\gamma} \sim M^3$$

$$Wi_{\text{stretch}} = \tau_R \dot{\gamma} \sim M^2$$

$$Wi_{\text{rept}} > 1$$

$$Wi_{\text{stretch}} \lesssim 1 - 10$$

Significant orientation (and flow induced crystallisation)

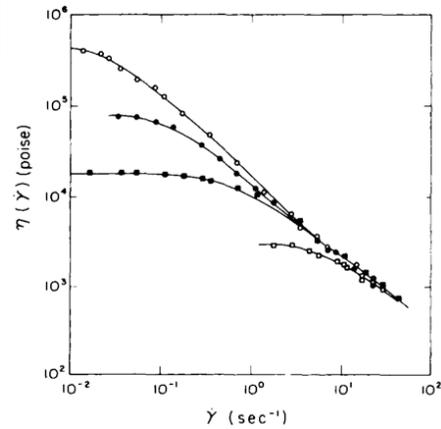
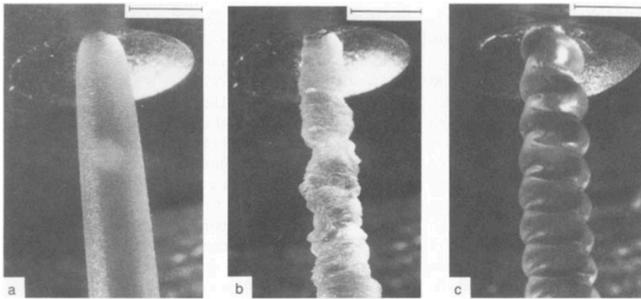
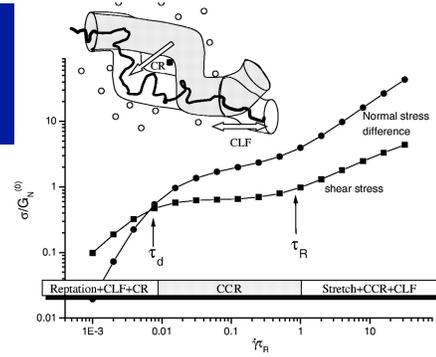
$$Wi_{\text{stretch}} > 10$$

Significant stretch (and oriented crystallization)

Typical nozzle parameters:  $Wi_{\text{rept}} \approx 100$ ,  $Wi_{\text{stretch}} \approx 10$

# Non-Newtonian Fluid Mechanics of Polymeric Materials

- Shear Thinning
- Rod Climbing
- Die Swell
- Spurt and slip

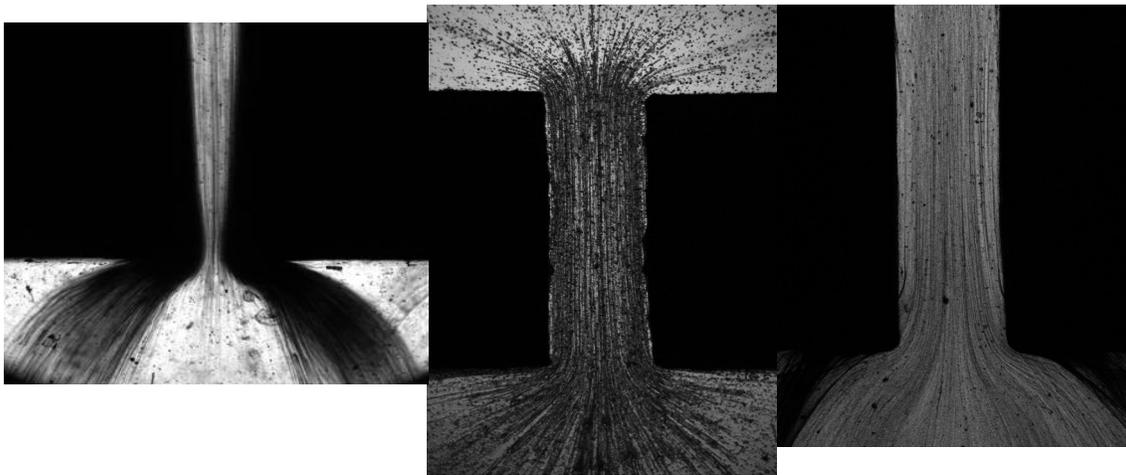


## Flow-induced crystallization during extrusion



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Example of polypropylene (L Scelsi, et al.. J Rheology (2009))



**Modelling:** Structure formation/crystallization, rheology, flow geometry.

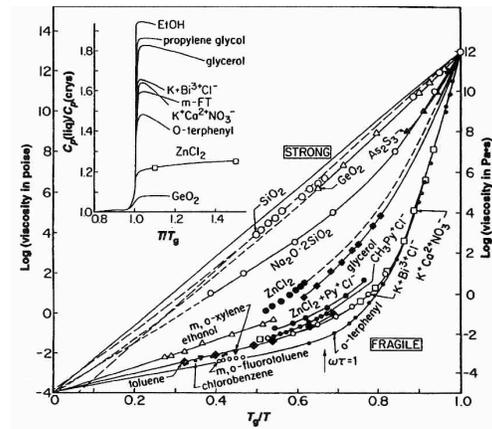
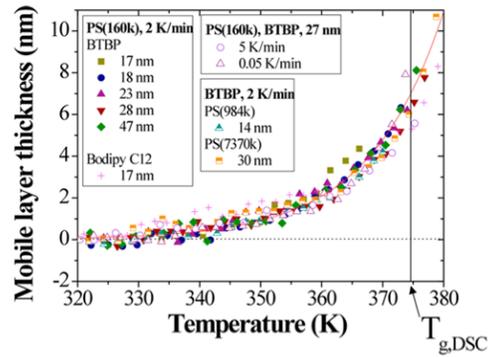
McHugh & Doufas; Fiber Spinning (JNNFM 2000);

Graham and Olmsted: flow-induced crystallization (Phys Rev Lett 2009)

## Scientific Issues in FDM

J Forrest & M Ediger,  
Macromolecules 2014

- Glass transition
- Polymer welding
- Crystallization
- Non-isothermal processes



A Angel, 1997

## Computational/Modelling challenges



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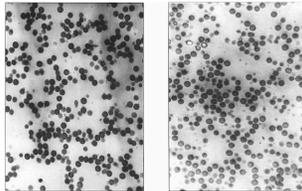
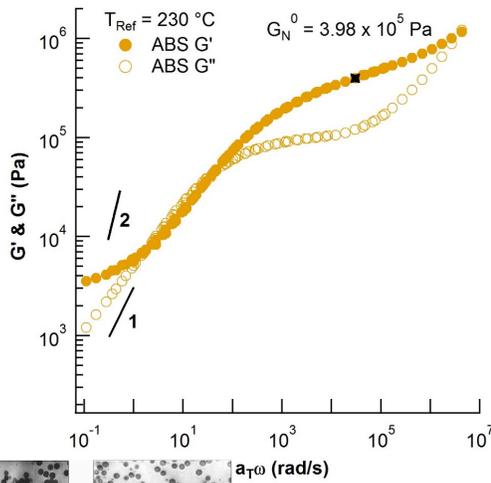
- Many coupled time-dependent quantities:
  - Molecular shape/structure/orientation/alignment
  - Temperature
  - Velocity field/deformation
  - Density
  - Moving/changing boundaries
  - Phase change materials
- Multiple scales (chemistry → polymer → mesoscale ordering → fluid mechanics of extruded filaments → bulk mechanical properties of composite FDM material).

# FDM Materials Polymer Rheology



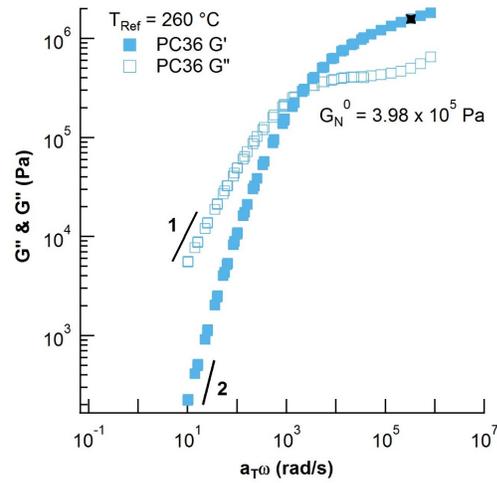
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## ABS Moduli



Composite (nanoparticles + copolymers)

## Polycarbonate



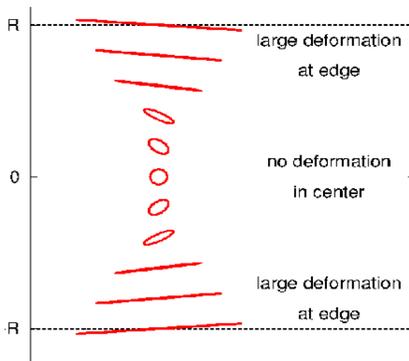
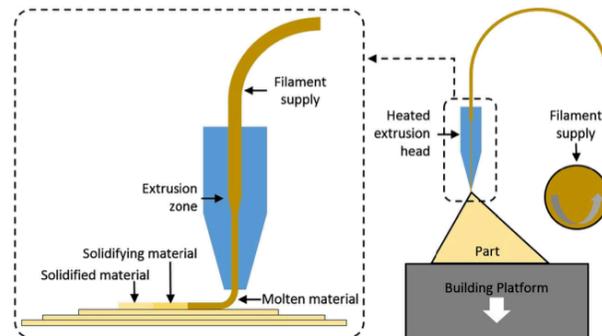
Linear polymer melt  
Reptation time

# Details of extrusion



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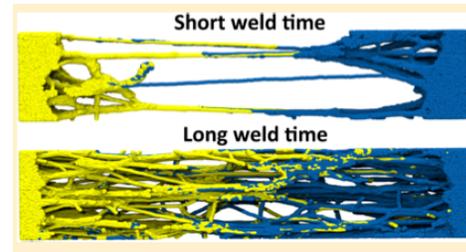
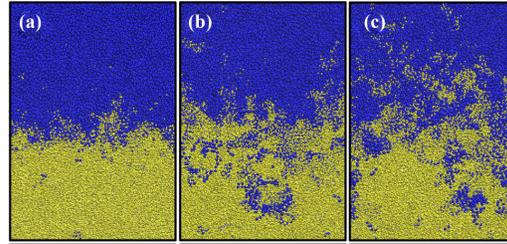
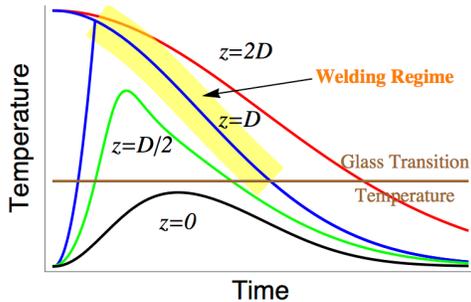
- Strong alignment and orientation in the nozzle.
- Molecular 'skin' layer remains well-aligned upon extrusion and deposition.



# Polymer Welding – A race against time!



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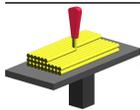
Ge, Periaha, Grest, Robbins [ACS Nan 2013, PRE 2014]

## Printing with Polymer Melts

Claire McIlroy (Georgetown/NIST)

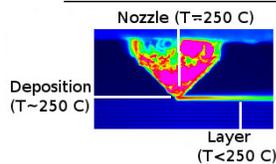
### Fused Deposition

#### Modelling



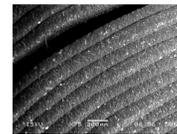
Extrusion of an **entangled polymer melt** into layers.

### Infra-Red Imaging



Non-uniform **temperature profile** and glass transition.

### De-bonding



Polymer alignment can **weaken welds** between layers.

### Three Stages of Printing:

- **Nozzle:** Steady axisymmetric pipe flow. High shear rates **stretch** and **orient** the polymer.
- **Deposition:** Map axisymmetric flow to elliptical layer. Complex **3D polymer configurations** across layer.
- **Weld:** Temperature-dependent relaxation of deformation. **Entanglement density** is key to welding characteristics.

# Non-Isothermal Processes: fiber modelling: semicrystalline polymers



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$$W \frac{dv_z}{dz} = \frac{d}{dz} [A(\tau_{zz} - \tau_{rr})] - \pi B \mu_a (v_z - v_d) + \rho g A + \frac{1}{2} \pi s \frac{dD}{dz}$$

$$c_{(1)} = -\frac{1}{\lambda_a(T)} \frac{k_B T}{K_0} \left( (1 - \alpha) \delta + \alpha \frac{K_0}{k_B T} E c \right) \left( \frac{K_0}{k_B T} E c - \delta \right)$$

$$\boldsymbol{\tau}_{sc} = 3n k_B T (\mathbf{S} + 2\lambda_{sc} (\nabla \mathbf{v})^T : \langle \mathbf{u}\mathbf{u}\mathbf{u}\mathbf{u} \rangle).$$

$$\rho C_p v_z \frac{dT}{dz} = -\frac{4}{D} h (T - T_a) + (\tau_{zz} - \tau_{rr}) \frac{dv_z}{dz} + \rho \Delta H_f v_z \frac{d\phi}{dz}$$

$$\frac{Dx}{Dt} = m K_{av}(T) [-\ln(1-x)]^{(m-1)/m} (1-x) \exp\left(\xi \frac{\text{tr} \boldsymbol{\tau}}{G}\right),$$

$$\lambda_a(x, T) = \lambda_{a,0}(T) (1-x)^2,$$

- Momentum
- Conformation
- Stress Constitutive Relation
- Heat Flow
- Crystallinity
- Timescales

**Outputs: orientation and structure of spun fibers.**

[Doufas, McHugh, & Miller, JNNFM 92 (2000) 27-66]

Molecular-based kinetics of flow-induced crystallization: Graham & Olmsted (PRL 2009)

## Rolie-Poly Models; apply to glassy polymers.



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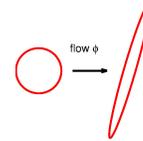
Tube Model



Deformation Tensor

$$\mathbf{A} = \frac{\langle \mathbf{R}\mathbf{R} \rangle}{3R_g^2}$$

Visualisation



### Rolie-Poly Equation

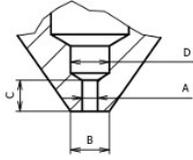
$$\frac{D\mathbf{A}}{Dt} = \mathbf{K} \cdot \mathbf{A} + \mathbf{A} \cdot \mathbf{K}^T - \frac{1}{\tau_d} (\mathbf{A} - \mathbf{I}) - \frac{2(1 - \sqrt{3/\text{tr}\mathbf{A}})}{\tau_R} \left( \mathbf{A} + \beta \left( \frac{\text{tr}\mathbf{A}}{3} \right)^\delta (\mathbf{A} - \mathbf{I}) \right)$$

- Reptation  $\tau_d$  for **orientation**: e.g. Shear =  $A_{r\phi}$
- Rouse time  $\tau_R$  for **stretch**:  $\text{tr}\mathbf{A} = A_{\phi\phi} + A_{\theta\theta} + A_{rr}$
- Entanglements:  $Z \approx \tau_d/3\tau_R = 37$
- Convective constraint release:  $\beta = 1, \delta = -0.5$

$$\tau_d = \tau_0 \exp\left(\frac{-C_1(T - T_0)}{T + C_2}\right)$$

# Polymer Deformation in the Nozzle

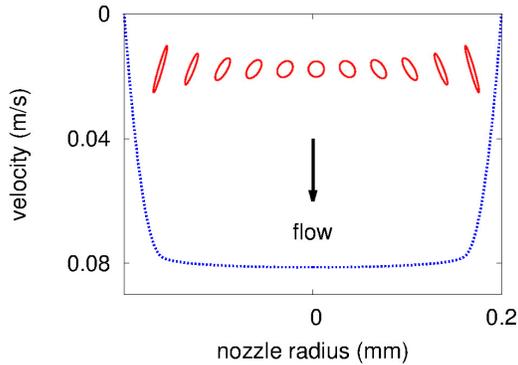
Fast Printing  $v_L = 100 \text{ mm/s}$



**#1 Nozzle:** Steady state axisymmetric pipe flow calculation for polycarbonate.

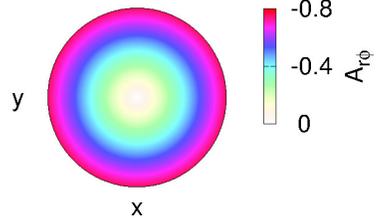
$T = 250^\circ\text{C}$ ;  $v_N = 75 \text{ mm/s}$ ;  $\dot{\gamma}_w = 3600 \text{ s}^{-1}$

Velocity Profile

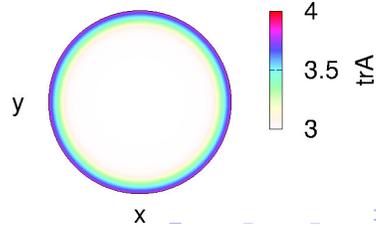


Ellipses represent how polymers become **stretched** and **oriented** near the nozzle walls.

Principle Shear:  $A_{r\phi}$



Stretch:  $\text{tr}\mathbf{A}$



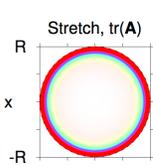
# Variable Entanglement Density

Ianniruberto & Marrucci J. Rheol. (2014)

**#1 Nozzle:** Modify entanglement density  $\nu = Z/Z_{eq}$

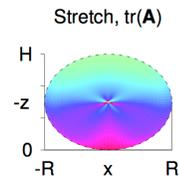
loss by convection

gain by diffusion

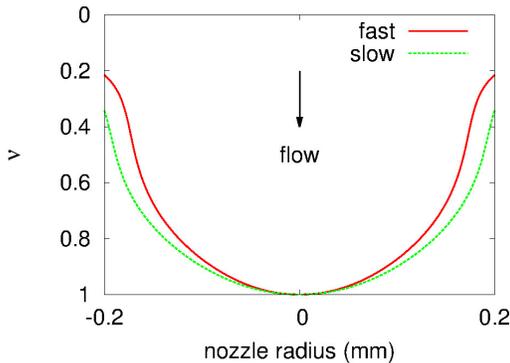


$$\frac{d\nu}{dt} = -\beta \left( \mathbf{K} \cdot \mathbf{A} - \frac{1}{\text{tr}\mathbf{A}} \frac{d\text{tr}\mathbf{A}}{dt} \right) \nu + \frac{1 + \nu}{\tau_d}$$

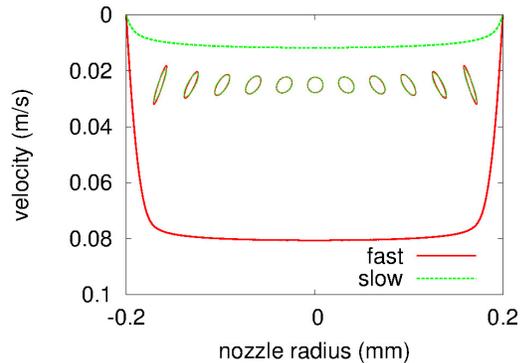
$$\tau_d = \tau_d^{eq} \nu^{1.2}$$



Entanglement Density

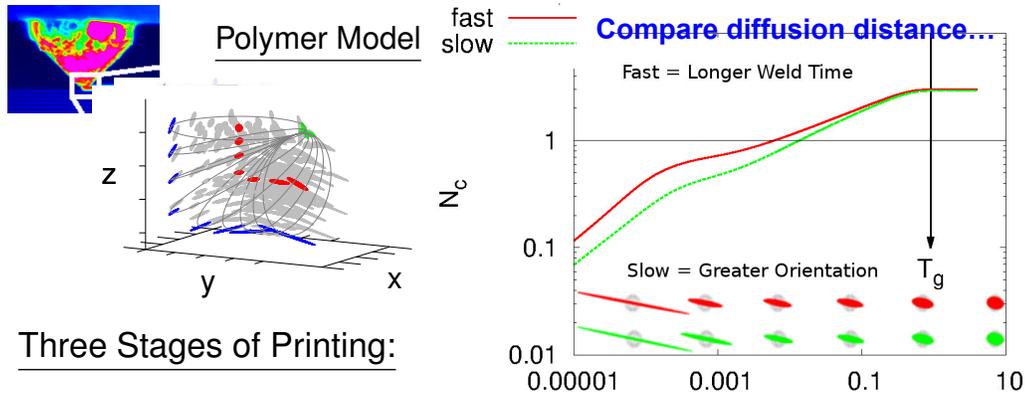


Velocity Profile



Greater **disentanglement** for **faster** printing speeds

# Printing with Polymer Melts



## Three Stages of Printing:

- **Nozzle:** Steady axisymmetric pipe flow. High shear rates **stretch** and **orient** the polymer.
- **Deposition:** Map axisymmetric flow to elliptical layer. Complex **3D polymer configurations** across layer.
- **Weld:** Temperature-dependent relaxation of deformation. **Entanglement density** is key to welding characteristics.

## Need for new/in situ metrologies



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- Temperature
- Molecular conformation/shape
- Welding/interfacial properties
- Mechanical properties: rheologies, elastic moduli, fracture strength and toughness, anisotropy, plasticity, ..
- Crystallinity
- Spectroscopies (IR, X-ray, neutron, Raman, fluorescence)
- Microscopies (light, Raman, TEM, SEM, ...)
- Interfacial characterization (neutron scattering)

Time dependence!!!

# Theory and Computational Methods/Needs



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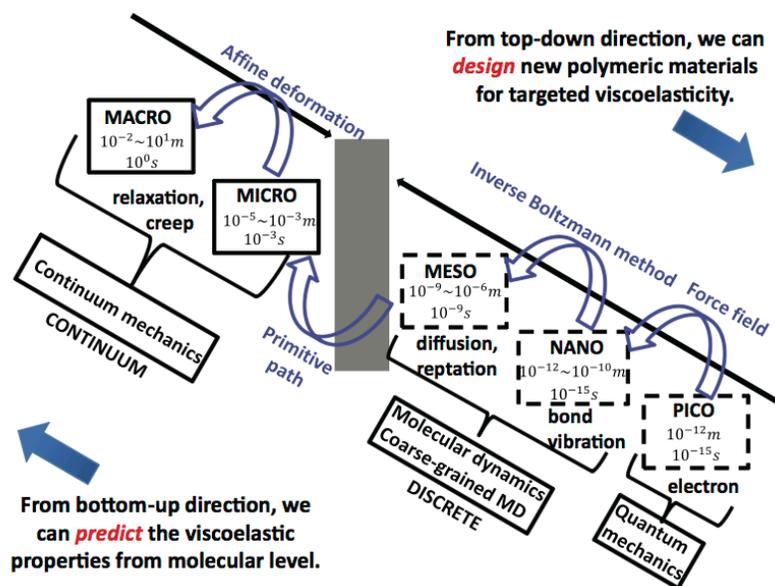
- Develop coupled molecular and thermodynamic fields (temperature, mass, velocity, crystallinity, orientation, ...). **Micron scale**
- Polymeric atomistic (or united atom model) simulation: welding, deformation of materials. **nm scale**
- **Experimental inputs:** temperature, extrusion conditions, build protocols, ....
- **Build theory and prediction around model materials; in conjunction with 'wild' materials.**
- **Finite element simulations** of parts/pieces; compare with experiment on deformation, fracture, yield. **mm scale**

# Coarse-Graining in Polymers –



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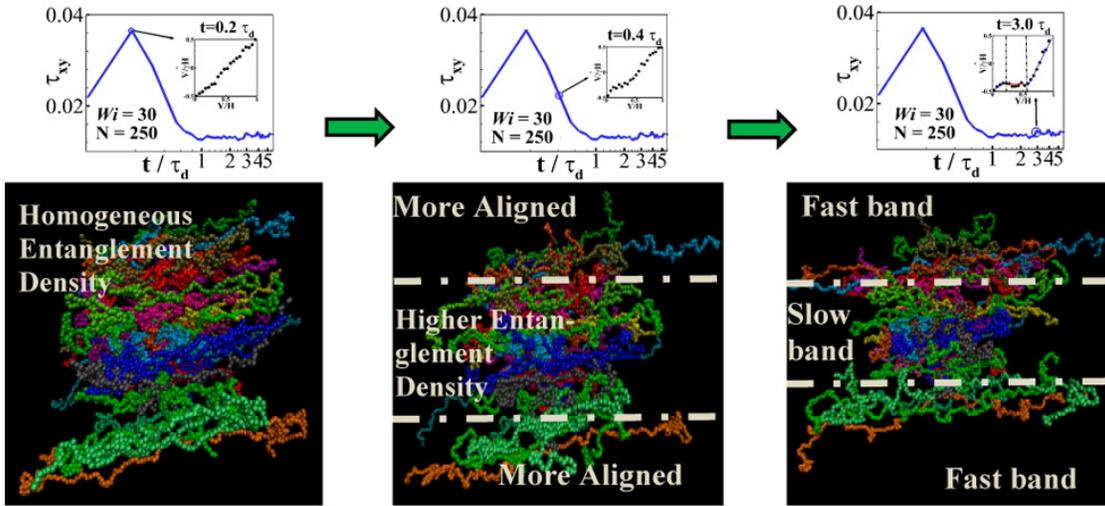
Kroger et al, Polymers 2013



# Current modeling capabilities in flow



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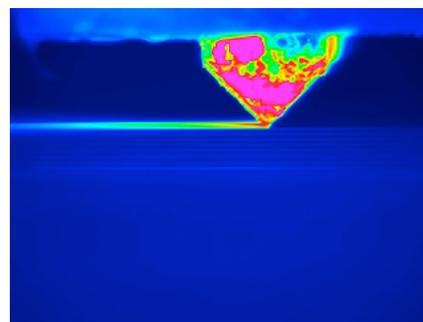
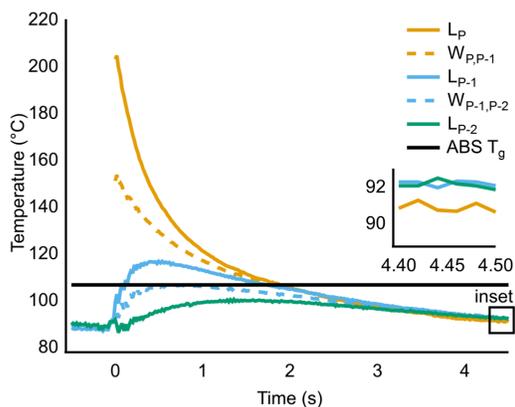
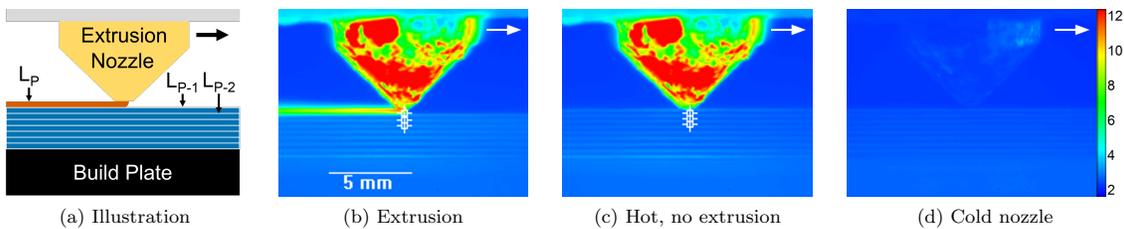


DPD Simulations,  $Z=17$ , 705 chains, startup at  $Wi=40$  for 5 reptation times (200 strain units). [Mohagheghi & Khomani, ACS Macro Letters 2015].

# Process Characterization Thermography [J Seppala, K Migler@NIST Team]



17 89



Infrared Image

## Scientific arenas for Additive Manufacturing



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1. Fundamental Scientific Issues:
  - Non-isothermal conditions. molecular alignment and welding, phase changes/glass transition, shrinkage and warping, crystallization
2. Unique Fundamental Theory/Computational approaches
  - Multiple scales (molecular [nm] to part size [cm])
  - Multiple dynamic fields (temperature, velocity, deformation)
  - Complex molecular and non-linear rheology/constitutive relations
3. Mathematical Models/Validation
  - Rheology: advanced models for polymer deformation.
  - Computation: flow-solvers for complex non-isothermal constitutive models for different build protocols.
  - Experimental: in situ characterization of T, orientation, etc; weld properties, mechanical performance.

## Scientific challenges for FDM



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5. Involves the most important (relevant) open questions in polymer materials and mechanics
  - The glass transition
  - Flow-induced crystallization
  - The relation of molecular structure to fracture strength and deformation.
  - .....
6. What multidisciplinary sciences are needed?
  - Chemistry, physics, metrologies, mathematics, computation, engineering (chem, mech, ...), computer science, massive data.
- 7. Partnerships**
  - Academia; National Labs (NIST, Sandia, LLNL,...); Industry (materials manufacturers, AM machine developers, end users and suppliers).