3D PRINT **QUALITY IN** THE **CONTEXT** OF PLA COLOR

by Forest Sears Candidate BS Materials Science and Engineering, MIT 2o16

Submitted to the Department of Materials Science and Engineering in partial fulfillment of the requirements for the degree of Bachelors of Science in Materials Science and Engineering at the

> **MASSACHUSETTS** INSTITUTE OF **TECHNOLOGY** June **2016**

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Abstract:

3D printing is a hot topic in manufacturing and a truly useful tool, but it has limitations. Print quality properties **-** like raft peelability, dimensional tolerance and surface roughness **-** are hard to calibrate perfectly. **A** common material used in fused deposition modeling (FDM) printers is polylactic acid (PLA). One print quality concern is how different colors of PLA print differently under the exact same settings. The inconsistency in print quality **by** color is bad for designers, students, and engineers who want to rapidly prototype effectively. Analyzing the thermal, chemical and mechanical properties of the different colors of PLA and relating it to the quality of the prints gives the user a chance to calibrate their machine effectively for higher quality prints. The quality of prints are quantified **by** scoring systems that measure three properties of a print: dimensional tolerance, how easily the raft peels from the print, and the surface roughness. The thermal properties of the different colors of PLA were analyzed using differential scanning calorimetry (DSC) up to 230°C. The integrals of peaks and troughs from the DSC – representing heat absorbed and released **by** the different colors of PLA **-** show that each color responds differently to thermal treatment. The mechanical strength of each color was found to be different through uniaxial tensile testing. Yellow and orange filament had high percent crystallinity at **-12.1%,** while having a high yield stress at **41-45** MPa, and a low yield strain at 6.6%-11% extension. Red and blue filament had low percent crystallinity at **~8.8-10.2%,** while having a low yield stress at **33-36** MPa, and a high yield strain at **18%-23%** extension. Additionally, Fourier transform infrared spectroscopy (FTIR) analysis determined each PLA color had unique additives. For calibrating printers for reliably high quality prints, crystallinity has a relationship with the amount of material extruded which could factor into qualities like dimensional tolerance and surface finish.

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Acknowledgements:

I'd like to thank MIT, the Department of Materials Science, and anyone else **I** accidently forgot for their part in making this happen. **I'd** like to specifically thank:

Mike Tarkanian, my thesis advisor, has been an incredible resource and I'm really thankful for his invaluable guidance and our talks outside of the thesis.

Mateo Pena-Doll, the VP of engineering at **NVBOTS,** has also been an incredible resource, helped me a ton at **NVBOTS** and was always checking in.

Forrest Pieper, Erik Pearson, and Stu Peloquin, of **NVBOTS,** also helped me get more familiar with the printers and answered all of the questions I ever asked them.

Paul Burke, former **DMSE** researcher, for his advice and work with statistical packages.

Jimmy Pershken, of **NVBOTS,** for his work with the CMM to measure the gauges.

AJ Perez, of **NVBOTS,** for offering to have the thesis done with the company in the first place.

Tim McClure, the safety manager of the **CMSE,** helped me work with the FTIR to determine unknown additives in the different colored samples of PLA.

Alan Lai, a materials science graduate student, helped me work with the **DSC** to determine the thermal properties of the different colored samples of **PIA.**

Thomas Eagar, a materials science professor, for feedback on my presentation during Structural Materials.

Geetha Barera, a materials science instructor, for helping me analyzing the **DSC** data and connecting me to PLA experts.

Yi Zhang, a materials science grad student, for providing me with raw materials from their PIA lab.

Steph Pavlick, Diego Huyke, and Dang Pham, peers of mine, for supporting me and making my life **a** little less stressful.

Lori Metcalf, my mom, for being my mom.

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1. Introduction/Background

1.1 Problem Statement

One problem with modern day fused deposition modeling (FDM) **3D** printing is that a sample is printed with the same settings regardless if the polylactic acid (PLA) filament is red, white or blue. Currently, all **3D** printers don't account for differences in PLA **-** even though each color of PLA has unique mechanical, chemical, and thermal properties. And unfortunately filament manufacturers want to keep all of their manufacturing techniques and methods quiet and proprietary. Additionally, these manufacturing companies keep the additives for each color of PLA private which would have their own set of unique thermal, chemical and mechanical properties. **If** the properties of each PLA filament are understood on a deep level this would intelligently motivate the calibration **of 3D** printers which would mean higher quality prints. Higher quality prints are extremely valuable in the **3D** printing space because quality is one of the biggest issues in modern **3D** printing. The surface quality **of 3D** prints are notoriously bad particularly famous among metal **3D** printers **-** and the resolution isn't always as good as the advertised micron precision.

1.2 Overview of Additive Manufacturing

3D printing is a buzzword that is thrown around a lot in modern technology discussions, specifically in the manufacturing realm. Perhaps a more appropriate word for the concept **of 3D** printing is the less trendy term, additive manufacturing (AM), but others exist like rapid prototyping, stereolithography or freeform fabrication. AM describes a process where a **3D** object is synthesized **by** forming successive layers of material. AM has been in the market since the **198os** but the AM industry has been making the most noise in the past five years. In **1984,** Chuck Hull **of 3D** systems developed a **3D** printer prototype that exposed photopolymers to light causing them to cure **-** a process that was developed three years before in Japan **by** Hideo Kodama **[1].** So AM isn't a new concept, but it is definitely growing. Today, **3D** printing is around a **\$4.1** billion industry. Compare the current AM industry to the AM market size in **1995,** which was only worth around **\$300** million **-** or better yet **-** compare the AM industry to its predicted market size: the projected size of the AM industry is as high as **\$21.1** billion in **2020** (older reports predict **\$8.6** billion which is still a massive industry) **[2][3].**

Prices **of 3D** printers vary wildly **-** a desktop version can be as low as \$1oo and an industrial version can be as high as **\$2** million. The higher price of industrial grade printers comes with a lot of capabilities. Industrial printers can print faster at a higher resolution, are more reliable, and are capable of printing in parallel. On the most basic level, typically industrial printers can work with more materials **-** from polymers to metals to ceramics to composites, whereas most desktop **3D** printers work with **ABS** (acrylonitrile butadiene styrene) and PLA (polylactic acid). The NVPro works mostly with PIA. PLA may be the polymer with the broadest range of applications because of its ability to be stress crystallized, thermally crystallized, impact modified, filled, copolymerized, and processed in most polymer processing equipment **[16].** Here's the chemical structure of PLA:

Figure **1.** Chemical Structure of PLA. Polylactic acid (PLA) is a biodegradable thermoplastic aliphatic polyester derived from renewable resources, such as corn starch, tapioca roots, chips or starch, or sugarcane.

PLA is perfect for **3D** printing because it's a thermoplastic which is strong, lightweight, and transparent (making it easy to dye). PLA is harder than **ABS,** has a lower glass transition than **ABS** (-6oC vs **~105C),** but is more prone to jams because of friction. PLA is also very sustainable relative to other pervasive plastics **-** PLA's manufacturing process is petroleum free, can be made from corn, potatoes or grains, is recyclable, and is biodegradable. Besides **3D** printing, PLA is used for injection molding, investment casting and used in diapers, packaging, and upholstery. PLA is commonly used in fused deposition (FDM) modeling printing which is one of seven types **of 3D** printing described **by** the **ASTM** below [4]:

- **1. Binder Jetting** is an additive manufacturing process in which a liquid bonding agent is selectively deposited to join powder materials.
- **2. Directed Energy Deposition** is an additive manufacturing process in which focused thermal energy (e.g. laser, electron beam, or plasma arc) is used to fuse materials **by** melting as they are deposited.
- **3. Material** *Extrusion* is an additive manufacturing process in which material is selectively dispensing through a nozzle or orifice.
- 4. **Material Jetting** is an additive manufacturing process in which droplets of building materials are selectively deposited.
- **5. Powder Bed Fusion** is an additive manufacturing process in which thermal energy selectively fuses regions of a powder bed.
- **6. Sheet Lamination** is an additive manufacturing process in which sheets of material are bonded to form an object.
- **7. Vat Photopolymerization** is an additive manufacturing process in which liquid photopolymer in a vat is selectively cured **by** light-activated polymerization.

Figure **2.** Representation of material extrusion or fused deposition modelling (FDM). The **NVBOTS** printer is an example of an FDM printer **-** it extrudes PLA, **ABS,** or various metals and creates objects layer **by** layer **[12][14].**

For desktop and industrial users of any of the seven types, why use **3D** printing over traditional manufacturing methods? What makes AM so valuable is how quickly it can speed up reiterating the design, prototyping, and testing process. For industry, this is incredibly valuable in product development. Currently after a product is developed, it needs to be redesigned to make manufacturing as easy, as quick, and as cheap as possible. This is a drawback **-** a designer should be tailoring a product to a company's users not the company's manufacturing machines and a designer should iterate the design process as many times as possible. At home or at small scale businesses, users don't have to deal with incredibly high upfront costs. AM allows all users to customize a part to specific needs and requirements, mitigate the issue of making complex geometries, be independent of expensive tools or molds, make parts that are sustainable because of material and energy efficiency, and skip tedious steps of the design cycle. And all of this at a price that is dropping rapidly. But AM isn't perfect. There are still issues with reliability, quality, and resolution. **3D** printing is lacking the high quality surface finish many other manufacturing techniques have, but this is less of an issue in industrial printers as compared to desktop printers.

1.3 NVBOTS Company Background

NVBOTS, or New Valence Robotics, is **a 3D** printer startup centered in Boston founded **by** four MIT students in **2013. NVBOTS** hopes to make the entire **3D** printer experience very easy for the user. **NVBOTS** is committed to creating a network **of 3D** printers that are fully automated, have an easy-to-use interface, and are capable of printing high quality parts. They're known for their printer, the NVPro, and their R&D facility, **NVLABS. NVLABS** recently developed novel technology that allows for **3D** printing multiple metals in the same build. The metals that they're capable to print with include steel, titanium, nickel, aluminum, zirconium, silver, and palladium. Their NVPro thrives in a collaborative environment, like classrooms as **NVBOTS** has an intense focus on education. Traditional **3D** printers lack a queuing system, the **STL** file must be directly loaded into the AM machine, and the part must be removed manually. The NVPro solves the issue of always needing to be physically at the printer. See appendix **A** for a peek at the web interface and the older model of the NVPro. **NVBOTS** lies in between the industrial and desktop realm **-** a realm that is relatively untapped. Because of the **24/7** automation, courtesy of their cloud based interface (see appendix), the NVPro appeals to both markets. **NVBOTS** hopes to become the standard **3D** printer in office, classroom and R&D spaces.

The NVPro is a material extrusion printer that has a resolution of **100** microns, an accuracy **95** microns, and a build volume **of 512** cubic inches **[6].** The feature that sets the NVPro apart from other material extrusion printers is that it's fully automated **-** the NVPro is equipped with a cloud-based web service. The printer has a camera that allows you to stream video to any device you want to monitor the print. It also comes with a queueing system and a robotic arm to remove parts that have been printed. This means a user can print **24/7,** from any location, and just using their iPhone. In this thesis **I** work with the NVPro to calibrate the parameters in the context of materials for higher quality prints.

2. Materials and Methods

2.1 General AM Work Flow

Every **3D** printer will have a specialized process to go from **3D CAD** model to a prototype. For example, a material extrusion **3D** printer operates fundamentally differently than a vat polymerization printer but the general AM work flow can be boiled down to generalized steps. There is a modeling phase, a building phase and a finishing phase. Here is a conceptualized six step process of AM [5]:

- **1. CAD.** Computer Aided Design is the first step of any AM machine. This creates a **3D** object or surface that the user intends to create.
- **2. Conversion from CAD to STL.** Thanks to Chuck Hull **STL** has become the de facto standard for how AM machines interpret our **3D** models. **STL** describes the closed surface geometry of each layer that motivates the slices made **by** the **3D** printer.
- **3. Machine Setup.** This is specific to each AM machine. This step includes uploading the **STL** file and the interpretation of the **STL** file **by** the AM machine. Besides basic upkeep like removal of previous parts or loading filament, each machine has its own calibration settings depending on the material. **A** web-based interface is part of this step when printing with the NVPro **-** a visualization is provided which makes the **STL** interpretation clear. The work in this thesis only uses Quantum3D PLA filament.
- 4. **Build.** This is the autonomous part of the AM process where the machine uses the given material to make the print layer **by** layer.
- **5. Part Removal.** Here the printed part is removed. With **NVBOTS** this part is automated **-** the part is removed and the next job in queue is started.
- **6. Post-processing.** Here any differences between the print and the **CAD** model are fixed. For example, support structures/hairs would be removed or surface finish made smoother.

2.2 Material Properties Tests:

2.2A Differential Scanning Calorimetry:

Differential Scanning Calorimetry **(DSC)** was used to investigate thermal transitions and properties of different colored PLA which are printed on the NVPro. **DSC** is a thermoanalytical technique in which the difference in the amount of heat required to increase the temperature of an empty reference and a sample are compared and measured as a function of temperature. The empty reference and the sample holder for this thesis are both **70** tl aluminum oxide ceramic crucibles. The **DSC** measures the weight of the sample and gives a curve that plots heat flow versus temperature and these curves can be analyzed to give: melting temperature, crystallization temperature, glass transition temperature, heat capacity, and heat of melting. Here's a **DSC** profile for PLA:

Figure **3.** Differential Scanning Calorimetry **(DSC)** Curves of Processed PLA. This is an example of a **DSC** running two thermal cycles. You can see how the second thermal cycle gets rid of the thermal history of the processed PLA **-** the trough at 150C doesn't exist in the second heat cycle [7].

This **DSC** profile highlights key features of **DSC.** The glass transition temperature can be seen at around 6oC, which is identifiable from the change in slope. The change in slope means the heat capacity of PLA changes once the glass transition temperature is reached. There isn't a peak because no latent heat is absorbed or dissipated **-** this is because glass transition is a second order transition. The heat of melting can be found **by** integrating the curve at the melting point which is the temperature that corresponds to the trough **-** around **150C.** For **DSC** analysis of PLA at **NVBOTS,** the goal was to investigate the different thermal behaviors of the different colors of PLA and compare the thermal behaviors to the thermal behavior of raw PLA which would give insight on calibrating the NVPro effectively.

2.2B Fourier Transform Infrared Spectroscopy:

Fourier transform infrared spectroscopy (FTIR) is a technique which is used to obtain an infrared spectrum of absorption or emission of a sample. FTIR measures how well a sample absorbs light at each wavelength of light. Each chemical bond absorbs light at different wavelengths and at different intensities so unique chemicals have unique FTIR spectrum. This means that FTIR gives a molecular fingerprint. FTIR is used to identify unknown materials, the quality of a material, and the amount of components in a material **[8].** Here's an FTIR spectrum for PLA:

Figure 4. FTIR Spectra for Unprocessed and Processed PLA. Neat is another way of saying the PLA is unprocessed. The FTIR gives a molecular fingerprint where each material has a unique signal. The difference in spectrum here gives insight into the manufacturing process, showing that water is removed during PLA processing **[9].**

This FTIR spectrum highlights the key features of an FTIR spectrum. FTIR plots descending wave number (a high wave number is high energy) versus absorbance. Neat PLA is raw PLA that hasn't experienced any manufacturing techniques or heat treatments – so PLA pellets rather than the filament used in 3D
 17 The Latitude Latitude Latitude COV above you can see the differences in the good rather in the 2000, 2000 am⁻¹ range. printing. In the FTIR above, you can see the differences in the spectra in the **2000-3000** cm-' range. These differences can be attributed to stretching vibrations of oxygen-hydrogen bonds **-** this is likely because water was present in the PIA before it's processed. Water was removed during post processing so you can see water peaks in the neat PIA sample.

For FTIR analysis of PIA at **NVBOTS,** the goal was to discover the additives in the different colors of PLA and see if these additives have thermal, mechanical or material properties that might give insight on calibrating the NVPro effectively. Investigating the additives and their properties can coincide with the **DSC** analysis. For example, if the FTIR analysis gives a lot of potential additives but one of the additives has a melting point at 125°C that matches the thermal fluctuations in the DSC at 125°C, it's probably a match.

2.2C Uniaxial Tensile Testing:

Uniaxial tensile testing was used to explore the mechanical property differences between each color of PLA. Understanding mechanical properties on a deep level would allow for intelligent calibration of 3D printers. An Instron, model 42o6, was used to see if there was a relationship between color and tensile strength. The tensile test was performed **by ASTM** standards **- ASTM D638** type IV **[13].** Here's a **CAD** model of the dog bone:

Figure **5.** Dog Bone for Uniaxial Tensile Stress. This was printed on the NVPro with an infill percentage of **75% -** the maximum infill percentage when working with the online interface. Infill is the percentage of a solid model that should be filled in with material when printed. The length of the narrow body of the dog bone is 33mm.

The instron grabs each head of the dog bone and pulls. Because the body of the bone is significantly thinner than the head the cross-sectional area of the body **-** using calipers **-** is used to calculate the stress. **All** samples failed at loads lower than 1200N at a rate **of 5** mm/min. Regardless of whether there's a relationship between mechanical strength and properties like raft peelability, dimensional tolerance or surface finish, characterizing the filament has value.

2.3 Pareto Charts:

Pareto plots are useful when analyzing data about the frequency of problems or causes in a process, when there are many problems but you want to focus on the most significant problem, and when analyzing broad causes **by** looking at their specific components. In Japanese manufacturing, pareto charts are one of seven basic tools of quality **-** a designation given to a fixed set of seven graphical techniques identified as being most helpful in troubleshooting issues related to quality [10]. Here's an example of a pareto plot:

Figure **6.** Pareto Plot Example Describing Defects in Titanium Investment Casting Defects. This pareto plot demonstrates that shrinkage is the most dominant problem responsible for defects in titanium casting. Pareto plots are useful in design of experiments **-** you would solve the shrinkage issue first and foremost since it's the dominant problem **[11].**

This pareto plot illustrates pareto plots' value. This plot shows us that in titanium investment casting, shrinking is the most important problem to solve and tungsten inclusion is the least important problem to solve. This means solving shrinkage in titanium investment casting has the highest priority **-** it wouldn't be efficient spending resources or timely/expensive tests investigating tungsten inclusion. For this reason pareto plots are invaluable in design of experiments **(DOE).** When designing the experiments of this thesis there's a drawback to following the pareto plots because it only accurately assesses the relative importance of the variables if the range is consistent among all of the variables. For example, first layer offset might be the variable that is actually most significant but my scale is off. If **I** chose a wide temperature range for first layer temperatures but a narrow width range for first layer offset, the pareto plot would incorrectly indicate that first layer temperature is the most significant. However after calibrating, this would be obvious if the samples at the low and high ranges have poor quality. In this thesis, **I** use the statistical package **JMP** to construct pareto plots.

2.4 Calibration Tests:

2.4A Alpha Test:

For organizational purposes **I** refer to different calibration tests as the alpha test, the delta test and the zeta test. The alpha test measures how easily **a** printed part can be removed from the raft. **A** Raft is **a** lattice of filament that is printed before and underneath the intended print. Rafts are primarily used to help with bed adhesion and, particularly key to **NVBOTS,** to help stabilize print removal. The raft ensures consistent adhesion of the part to the printbed, which is important for maintaining print quality and part removal reliability. **By** printing the same lattice under every part, only varying in size based on the size of the print, the behavior of the printed part during removal can be predicted and the removal can therefore be reliable. It's easier to wedge the removal blade under a raft then it is a part directly printed to the bed. The larger the part, the harder it is for the blade to get underneath a part if it's printed directly on a bed, rather than on top of a raft. In short, the raft works with mechanism that removes parts automatically and makes it effective reliably. However, separating the print from the raft is something that needs to be fine-tuned. **If** the raft doesn't separate from the printed piece, this isn't the geometry the user wanted and the broken, half attached raft simply looks bad. The lattice of the raft isn't the kind of resolution anyone wants from their **3D** printer. **If** the raft separates too easily from the first layer, it's usually due to the quality of the first layer being poor, which propagates throughout the print, making the entire print quality poor. So there's a balance **-** between raft peelability and feature clarity **-** that needs to be fine-tuned **by** working with different parameters.

Raft peelability and resolution were balanced **by** printing a specific part and using a specific scoring system. The scoring system is based on the part below in figure **7:**

Figure **7. CAD** Model of the Alpha Test Part and Raft Example. Figure **7A** is the **3D** model of the alpha test part and Figure **7B** is an example of a raft **[17].** The alpha test model is based on making the raft peelable while putting that peelability in the context of what customers care about **-** quality. **A** part that peels very easily but has a rough surface or nonuniform surface isn't good enough.

There are **16** features: 2 hexagons, **2** circles, **2** triangles, **2** squares, **2** boomerangs, **2** holes, and 4 corners. Each feature is awarded a half point for having no raft attached after peeling (prioritizing raft peelability) and a half point for having defined features (prioritizing resolution). This means a perfect part will receive a score of **16.** The score quantifies the raft peelability and print quality which makes deciding the next calibration steps easier.

2.4B Delta Test:

One of the most obvious trait of a high quality print is dimensional tolerance. Without dimensional tolerance, at best, prints don't look the same as they do in **CAD,** and at worst, parts warp potentially damaging the printer. Dimensional tolerance was calibrated using a printed part and a set of gauges below in Figure **8:**

Figure **8. CAD** Model of the Delta Test Part and Delta Test Gauges. The cube gauge requires interesting geometry at corners to avoid seams formed during the printing process. Using a coordinate measuring machine (CMM), the female cylinder gauge diameter was 11.983mm with a cylindricity **of 0.0348,** the female cube gauge had dimensions 12.oiommx12.ol3mm, the male cylinder gauge had a diameter of **11.901mm,** and the male cube gauge had dimensions of 11.984mmx11.973mm.

The scoring system uses a male and female gauge to test male and female features on the printed part. For **example, a 12mmx12mm** female cube gauge would measure each of the male cube features. **If** the female cube gauge was too small to get a slip fit on any male features it's awarded **1** point (top of figure **8),** if it makes a slip fit on 11.8mm it's awarded **2 points,** if it makes a slip fit on 11.9mm it's awarded **3** points, if it makes a slip fit on 12.omm it's awarded 4 points (perfect **-** the middle feature), if it **makes** a slip fit on **12.1mm it's awarded 5** points, if it makes a slip fit on 12.2mm it's awarded **6** points, and if the female gauge was too big to get a slip fit on any male features it's awarded **7** points (bottom of figure **8).** This means a perfect part would have a score of **16** and a standard deviation of o meaning the two male and two female features have perfect slip fits with the gauges (scores of four for the four features). The score quantifies the dimensional tolerance which makes deciding the next steps for calibration easier.

2.4C Zeta Test:

Another obvious trait of high quality **3D** prints is a print with high surface quality. Particularly for fine details, surface finish is the user's first impression of the print. The test for surface quality was done using the **CAD** model shown below:

Figure **9. CAD** Model of the Zeta Test Part. This was the print used to calibrate surface roughness for each color **by** varying extrusion multiplier, perimeter acceleration, perimeter speed, and perimeter extrusion width percentage. The balance of the zeta test is in a smooth, clean surface finish and clear, well defined features.

This model has a few types of test features. The cone is a spot where hairs tend to form, which are unwanted side-effects of extruded fiber hair on the feature because the extrusion cannot start or stop without the extra "hair" attached. The half cylinder-half tube feature needs to have a constant radius. The positive and negative squares, triangles, and circles, and the planar areas in between, give the viewer an indication of a standard level of surface roughness. The placement of the features also give different area sizes for testing how the surface finish relates to area size. For example, very small areas are hard to get a

nice surface finish on because the machine changes direction too fast, which causes shaking, which causes resonant marks on the surface. The zeta test is scored **by** ranking the samples **-** the best surface finish is awarded the highest number and the worst surface finish is awarded the lowest number.

3. Results and Discussion:

This results and discussion is split into two parts: a material properties section and a calibration section. The goal of this thesis is to relate the mechanical, thermal and chemical properties of colored PIA filament to the calibration of a **3D** printer for qualities like raft peelability, dimensional tolerance and surface finish for each colored PIA filament. Understanding the relationship between material properties and calibration would allow any **3D** printer user to intelligently make their machine print higher quality parts.

3.1 Thermal Testing - Differential Scanning Calorimetry (DSC):

Differential scanning calorimetry tests gave insight on the thermal properties of each of the PLA colored filaments and the raw PLA pellets. **A DSC** was run from either a temperature range **of 25⁰ ^C**to **2300C** or a temperature range **of 250C** to 2000 C. The first run with the **DSC** had higher temperatures because **2300C** is the highest temperature the extruder reaches in the NVPro. For the sake of time, scanning samples to **2000 ^C**is faster and less messy especially when doing multiple cycles. At **2300 C,** the melted PLA strongly adheres to the crucible after solidifying, meaning a solvent is needed in order to remove the PLA from the alumina oxide ceramic crucible. However, since the extruder gets to 230°C, any interesting thermal properties in the 200°C to 230°C should be investigated entirely. The differences in thermal behavior between filament colors from **200⁰ ^C**to **2300C** weren't significantly different if you compare figure **10** to figure 12A-G:

Figure **10. DSC** Scan of Colored PLA Filaments from **25'C** to **230'C.** The placement of these graphs on the *Y* axis **-** where Y is the heat flow **-** is meaningless and just serve as a way to see all the samples on one graph. This means the heat flow of white, grey and red are not lower than the heat flow of blue and yellow. Each color represents the colored PLA **-** blue, yellow, red and grey **-** except white is represented **by** black. Each sample has a unique mass so the relative size of each the peaks aren't comparable.

Looking at figure io, there aren't many unexplained thermal fluctuations in the **200'C** to **230'C** range, although red has interesting behavior as it starts to cool down and the heat flow drops faster than the other PLA filaments. There are thermal fluctuations at around 140'C which could indicate an additive in the filament responding to the thermal scan. Another **DSC** test was needed because the grey and orange (not pictured in figure io) samples both had interesting crystalline peaks. **If** you follow the grey curve in figure 10 you can see the small peak at around 100°C $-$ it's hard to accurately integrate a peak that small. In order to get the inherent properties of PLA, the thermal history should be removed **by** running multiple thermal cycles [16]. Thermal history means there are properties of the material where the material processing **-** like extrusion **-** affected the thermal properties rather than being inherent to the material. Erasing the thermal history of PLA is as easy as running two thermal cycles as you can see in figure **ii.** The second thermal cycle is more representative of PLA because a second thermal cycle gets rid of the processing techniques effect on the thermal data in the **DSC** curves. Analyzing the **DSC** results after two cycles weights the inherent properties of PLA more so than the experience of the colored PLA filament as it is being extruded from the NVPro.

After performing three thermal cycles on raw PLA, it was found two cycles were needed to get rid of the thermal history which can be seen in figure **11.** The first cycle is arguably the most important because it most closely mimics the process **of 3D** printing similar to the **230'C** scan in figure **10 -** the PLA is cut from filament and is heated to 200°C. However, the heating rate is much slower at 10° C/min using the **DSC** as compared to a **3D** printer's extruder in any **DSC** scan. **A 200*C** sample placed in ambient temperature will cool faster than 10°C/min. The second cycle is important because it acts as a way to get rid of the thermal history of the PLA filament. Because filament manufacturers keep their manufacturing methods proprietary we don't know, for example, if the heating rates during the extrusion process **-** from pellets not filament **-** are equal across all colors. We also don't know what kind of additives are in each color and what kind of effect those additives can have thermally, mechanically or chemically. To determine how many thermal cycles were needed to get rid of the thermal history, raw PLA was cycled three times. The thermal curves for the raw PLA pellet can be seen here below:

Figure **11. DSC** Curves of Three Thermal Cycles of Raw PLA. The first curve is very different while the second and third follow generally the same shape. The melting temperature and crystallization temperature are both higher during the first cycle as compared to the second and third.

Based on the above curve, only two cycles were needed for each color, because the differences in the second and third curve for the raw PLA are negligible. Thermal cycles are important here because polymer processing introduces properties that could not be indicative of our PLA filament. When polymers are extruded **-** like they must be to yield the rolled filament a consumer buys **-** the crystallinity of the polymers changes. This is because during extrusion polymer chains are forced to align parallel to the direction of extrusion. As polymers align themselves and the crystallinity gets higher as ordered polymer chains get denser, the strength of the polymers get higher too. In **DSC** curves, this processing watermark would be obvious because crystalline peaks would be present when in the first cycle but not in the second cycle. However, investigating the first thermal cycle is important to **3D** printing because the first thermal cycle tests the thermal properties of the filament **-** this is the PLA that the **3D** printer extruder is directly dealing with. The first thermal cycle is the most important because it is the closest analog to the process going on during **3D** printing. However, the second thermal cycle is important because it gives information on the inherent properties of PLA. Investigating the raw PLA pellets has value because every colored filament is made from these pellets and other additives. Comparing the **DSC** scans of raw PLA to colored PLA allows us to attribute the thermal fluctuations in the colored PLA samples' DSCs to the thermal properties of additives in the colored PLA. The melting temperatures, crystallization temperatures, and glass transition temperatures are similar across the board among colored PLA and raw PLA. The glass transition temperature can be seen around **550 ^C**from the change in slope of the **DSC** curve without a peak or a trough. The peak indicates the crystallization temperature around 1ooC and the trough indicates the melting temperature at around 170°C. Each color has a slightly different melting temperature which could be indicative of additives playing with the thermal properties. Here are the **DSC** curves for each sample:

Figure **12A.** Two Thermal Cycles of Orange PLA in the **DSC.** The black curve represents the first cycle of orange PLA in the **DSC.** You can see the second cycle lacks the crystallization peak present in the first cycle. Additives could be responsible for the thermal fluctuations present between the glass transition and melting temperatures which are not visible in the raw sample.

Figure 12B. Two Thermal Cycles of Yellow PLA in the **DSC.** The black curve represents the first cycle of yellow PLA in the **DSC.** You can see the second cycle lacks the crystallization peak present in the first cycle.

Figure **12C.** Two Thermal Cycles of Grey PLA in the **DSC.** The black curve represents the first cycle of yellow PLA in the **DSC.** The grey sample is interesting because in the second cycle you can see a slight crystallinity peak.

Figure **12D.** Two Thermal Cycles of Blue PLA in the **DSC.** The black curve represents the first cycle of blue PLA in the **DSC.** You can see the second cycle lacks the crystallization peak present in the first cycle.

 $\frac{1}{2}$

Figure **12E.** Two Thermal Cycles of White PLA in the **DSC.** The black curve represents the first cycle of white PLA in the **DSC.** You can see the second cycle, represented **by** pink here, does have the crystallization peak present in the first cycle. Another interesting point is that in either cycles it seems the PLA doesn't solidify which at temperatures as low as **25'C** is impossible.

Figure **12F.** Two Thermal Cycles of Orange PLA in the **DSC.** The black curve represents the first cycle of red PLA in the **DSC.** You can see the second cycle lacks the crystallization peak present in the first cycle.

Each **DSC** curve has unique characteristics. The slope of these graphs are interesting because they tend to be represented flat. This is most likely an issue of the baseline not subtracting from the samples. However, this is not an issue for calculating the glass transition, melting temperature, the heat of melting, the heat of crystallization, or the degree of crystallization. The thermal **DSC** data can be summarized in the tables below:

Table **1.** Thermal Properties of Colored PLA Filament from the First **DSC** scan. The PLA colors, including a raw pellet of unprocessed PLA, are organized **by** descending percent crystallinity. The high percent crystallinity of the raw PLA indicates that either additives or the manufacturing process makes the colored PLA filament less crystalline or that the variability in the chemical orientation of PLA makes the colored PLA filament less crystalline.

The raw PLA is less crystalline **-** more amorphous **-** than our colored samples. Even at three cycles, the raw PLA still has a crystallinity peak, whereas in general, the colored PIA samples lose this peak after the second cycle. However, the white sample (figure **12E)** definitely keeps it crystalline peak and the grey sample (figure **12C)** shows evidence of a small peak. During the second thermal cycle the PLA appears to be amorphous because of the missing crystalline peaks. To see the thermal data of the second cycle summarized see appendix B. The PLA filament is more crystalline than raw PTA which indicates that the additives and dyes in the PLA filament or the manufacturing process make PLA filament more crystalline. The previous work with FTIR suggests that manufacturing methods must be playing a role because the strength of signal in the FTIR spectrum didn't completely correlate with percent crystallinity. Filament manufacturers could be flash cooling their extruded filament via an ice or water bath. During extrusion, the temperature of the polymer is over the glass transition temperature which means the polymer chains are free to move around and organize themselves into crystalline domains. However, if cooled too quickly the polymers wouldn't be able to organize themselves into crystalline domains fast enough and the polymer would be more amorphous. Based on our first thermal cycle, the filament is not amorphous on the spool so the cooling rate must not be fast enough to make it amorphous. It's possible that cooling rate would be fast enough to cause the PLA to be amorphous but the additives serve as heterogeneous nucleation sites. Heterogeneous nucleation is when foreign particles or rough surface areas act as primers for crystal to grow. The balance between heterogeneous nucleation and the high cooling rate could be responsible for the increase in percent crystallinity when comparing colored PLA filament to raw PLA pellets. Both PTA types have unique additives and unique processing.

In table **1,** the percent crystallinity isn't absolute. **I** used the latent heat of melting of lactic acid which **I** would expect to be somewhat similar to PIA. Here's the equation for percent crystallinity:

$$
PERCENT \; CRYSTALLINITY = \frac{\Delta Hm - |\Delta Hc|}{\Delta H_m^9} \times 100
$$

Where ΔH ⁰_n is the latent heat of melting. Although the latent heat of melting of 202.5 J/g for lactic acid **[15]** isn't going to be the exact latent heat of melting for PLA the percent crystallinity values would scale anyways. Since there are two optical arrangements for lactic acid (L-lactic acid, D-lactic acid), and three optical arrangements for lactide (L-lactide, D-lactide, meso-lactide), there are a variety of PLA structures available. However, since ΔT_m° decreases with decreasing optical purity $-$ the ability of a chiral molecule to rotate the plane of plane-polarized light $-$ it is expected that using a constant ΔH_{m}^{0} across all optical compositions will introduce error **[16].** Basically, the latent heat of melting isn't constant among PLA because PLA varies so much, but it doesn't matter because the relative differences in percent crystallinity is what matters. The percent crystallinity of red for example isn't exactly **8.8%** but it's definitely less crystalline than orange. The chemical differences among types of PLA could also be responsible for the crystallinity differences between colored PLA filament and raw PLA pellets.

3.2 Mechanical Testing - Uniaxial Tension:

Mechanical properties are important for more than just understanding PLA and relating it to calibration tests. Since these printers are designed for people to rapid prototype it's important to have a sense for how strong these PLA prints can be. For the engineer, student or designer that needs a robust part, it's valuable to know what magnitude of loads the print can take. Another plus of investigating the mechanical properties is the approachability of mechanical testing. Not everyone that wants to calibrate their **3D** printer has access to MIT and its great **DSC** and FTIR machines. But if mechanical testing can relate to chemical or thermal properties that are hard to test, this type of smart calibration can be more widespread. Mechanical testing for this thesis was done using an instron. The orange PLA dogbone failed at the highest stress and the red PLA dogbone failed at the lowest stress. Table 2 gives a summary of the stress for each PLA color:

Table 2. Mechanical Properties of PTA Colors from Uniaxial Tensile Tests. The stress was found **by** dividing the yield point **by** the cross section area of the bone body. For the data used to calculate these material properties see appendix **C.**

The overlaid stress-strain curves for each color can be seen below in figure **13** and individual stress-strain curves **by** each color can be seen in appendix **C:**

Figure **13.** Stress-Strain Curve for the Uniaxial Testing **by** PIA Color. The yield stress was highest for orange PLA and lowest for red PLA. The extension stops after fracture which you can see with orange PLA around **7%** extension.

Looking at figure **13,** red PLA can experience up to **3.5** times as much strain as orange PLA and the yield stress of red PLA is 80% of the yield stress of orange PLA. This makes sense considering the percent crystallinity of orange is higher than the percent crystallinity of red. Crystallinity increases yield strength because the secondary bonding is enhanced when the molecular chains are closely packed and parallel. During uniaxial testing when the sample is in tensile stress, the PLA chains orient themselves along the dog bone and become denser. As these polymer chains lengthen and line themselves up next to each other, there are more sites for secondary chemical interactions, these small forces accumulate, and make the sample stronger. This enhanced polymer interchain bonding inhibits polymer interchain mobility which means we expect a bigger yield stress.

Here's a table showing the relationships between the thermal and mechanical properties:

Table **3.** Relationship between Chemical and Mechanical Properties of Colored PLA. There seems to be a proportional relationship between crystallinity and yield stress and an inversely proportional relationship between crystallinity and yield strain. Red PLA also has a significantly smaller Young's Modulus as compared to every other color of PLA.

This table confirms that as crystallinity increases so does the strength of the print which can be explained **by** polymer chain alignment during uniaxial stress. Young's modulus is a measure of stiffness that should be a material property of PLA **-** and every color has a comparable Young's Modulus except for red which is clear from figure **13** because the slope is of the elastic region is less than other colored PLA samples. The very high strain of red is likely why the Young's Modulus is low. Future work would include more samples to make these numbers more robust **-** particularly exploring the Young's Modulus of red more closely.

3.3 Chemical Testing - Fourier Transform Infrared *Analysis:*

Fourier Transform Infrared analysis gives each material a molecular footprint **-** each unique material has a unique spectrum. This is useful to us if we can identify the additives then we have insight about how materials will respond to being heated and extruded. The FTIR analysis done on each colored PLA sample, each sample is compared to white because it's expected that white would have the least amount of of additives **-** considering raw PLA is transparent. Here are the FTIR spectrum for each colored PLA compared to white that confirm this:

Figure 14A. FTIR Spectrum For White vs Orange. This is the spectrum for both white PLA (represented **by** blue) and orange PLA (represented **by** orange). White is expected to have less additives and this is confirmed **by** looking at the signal near the wavenumber **-** the x axis **- 2900 cm-'.**

Figure 14B. FIR Spectrum For White vs Red. This is the spectrum for both white PLA (represented **by** blue) and red PLA (represented **by** red). White is expected to have less additives and this is confirmed **by** looking at the signal near the wavenumber **2900 cm'.**

Figure 14C. FTIR Spectrum For White vs Blue. This is the spectrum for both white PIA (represented **by** black in this case) and blue PLA (represented **by** blue). White is expected to have less additives and this is confirmed **by** looking at the signal near the wavenumber **2900 cm'.**

Figure 14D. FTIR Spectrum For White vs Grey. This is the spectrum for both white PLA (represented by blue) and grey PLA (represented by grey). White is expected to have less additives and this is confirmed by looking at the signal near the wavenumber 2900 cm⁻¹.

Figure 14E. FTIR Spectrum For White vs Yellow. This is the spectrum for both white PLA (represented **by** blue) and yellow PLA (represented **by** yellow). White is expected to have less additives and this is confirmed **by** looking at the signal near the wavenumber **2900** cm.

White has less additives than any of the other PLA colored samples because its spectrum has a smaller signal. White doesn't have the lowest or highest crystallinity so that must mean the chemical additives are more complicated than just plasticizers. If the additives were purely for crystallinity purposes, the DSC data would point to white being the least crystalline. The additives must then play a complicated role in the material properties or could be intertwined with the manufacturing process. It's possible that white is the least crystalline but is cooled slowly during production **-** making it more crystalline **- by** the manufacturer Quantum3D. The FTIR libraries were unfortunately not extensive enough to find the exact additives in the colored filaments, but if the additives become known these spectra are useful. Looking at the unique peaks in the spectrum, you can compare the strength of the of the unknown peak's signal to a unknown peak's signal to get concentration of additives. So at the wavenumber **of** 2900 cm', the concentration of the additive can be found **by** comparing the peak height to a known concentration peak height. The FTIR software predicted that cellulose propionate was an additive – which is a polymer that activated cellulose to polymerize. **I** don't think the additive is cellulose because the spectra don't match up well, but PLA-cellulose is a common composite for PLA **-** so it's possible that cellulose is added to commercial PLA filament for added strength.

The chemical properties from FTIR, the mechanical properties from uniaxial testing and the thermal properties from **DSC** should relate to the calibration tests below. The hope is **by** studying these material properties, **3D** printer users can intelligently decide what settings are best for their machines to get parts with peelable rafts, parts with dimensional accuracy, and parts with a good surface finish. Slic3r, a free **3D** slicing software for **3D** printers, settings that can be changed with respect to these calibration tests include extrusion multiplier, extruder speed, and extruder acceleration. For example, a polymer that is **highly** crystalline requires more torque to extrude because a higher crystalline polymer is harder. So a polymer that is very crystalline would probably need a higher extrusion multiplier than a polymer this is less crystalline. The difference between the materials properties investigation and the calibration is that calibration is framed around the materials properties. The material properties are used as a tool to help users calibrate their **3D** printers.

3.4 Alpha Calibration Test:

Alpha test is **a** test of raft peelability **- a** measure of how well **a** printed part can be removed from a raft. **A** Raft is **a** lattice of filament that is printed before and underneath the intended print. There were five variables tested during the screening design experiment for raft peelability: first layer offset, first layer extrusion width percentage, first layer temperature, first layer speed, and first layer acceleration. As part of the screening design process, a pareto plot made **by** Paul Burke (see appendix **D)** found that first layer offset and first layer extrusion width (FLEW) percentage were the most important problems that needed to be tackled. The pareto plot was made **by** printing a minimum amount of combinations determined **by** the statistical package software to give us an idea of how each of the settings interact with each other. It determines the biggest problems and found offset and FLEW percentage to be the biggest problems. Since these two variables are the biggest problems we printed many samples changing these two settings between three different values to find what gave us the highest quality print. The highest quality part is quantified **by** using the scoring system described in figure **7.** The variables for the first round of the alpha test can be found in table 4 and the scores can be found in table **5:**

Table 4. List of Settings and their Values for Alpha Test for Orange. The offset, or the distance between the lines in the first layer, had a value **of 0.1** mm, **0.2** mm, and **0.3** mm. The first layer extrusion width percentage, or the extrusion multiplier of the first layer, had a value **of 170%,** 18o% and 190%.

Table **5.** Scores for the Alpha Test for Orange. The optimal first layer offset and extrusion width were found to be **0.2** and 180 respectively. This means that the first layer lines traced out **by** the **3D** printer should be spaced out **by** 0.20 mm and extrude 18o% more material.

For data on other colored filament besides orange see appendix **E.** From the pareto plot in appendix **D,** the most important variable is the first layer extrusion width percentage.

Table **6.** No Clear Proportional Relationships between First Layer Extrusion Width Percentage, Percent Crystallinity, and Yield Stress. Red and Blue have the lowest percent crystallinity and yield stress but have respectively the highest and lowest extrusion width percentage. For permutations including the variable offset see appendix **E.**

Although there isn't a simple positive linear relationship between first layer extrusion width percentage and crystallinity that doesn't mean there aren't any relationships at all. This assumes that the scoring system is perfect and relates entirely to the quality of the part which is too optimistic. **A** white print potentially won't get a score **of** 12, **13** or 14 which means that although all six colors have comparable max scores the scores shouldn't be treated equal. The white filament struggles to achieve these high scores as consistently as orange and yellow do. For example, the average score for white PLA during the first round of the alpha test was **5.7** whereas the average scores for orange and yellow during the first round of the

alpha test was **7.6** and **7.7** respectively. Each PLA color is not perfectly calibrated for the NVPro **-** isn't likely to be be able to be boiled down to one variable or calibration **by** color wouldn't be a problem worth investigating.

The PLA colors that seem to have the best raft peelability are orange and yellow while the color that struggles with raft peelability the most is white. Self-adhesion is stronger as crystallinity goes up in chlorinated isotactic polypropylene **[17] SO** it's expected that PLA would follow suit as a fellow semi-crystalline polymer. **A** polymer that self-adheres is going to have a harder time peeling from a raft. The percent crystallinity of orange and yellow is higher than the percent crystallinity of white so it would be reasonable to expect orange and yellow to have worse raft peelability. Additionally, it's important to take in account the heat flow rates of each PLA sample. Here is a table of white, yellow and orange heat flow rates:

Table **7.** Heat Flow Rates and Average First Round Score for Orange, Yellow and White PLA. Yellow and orange peel from the raft easily because the cooling rate is high **-** cooling faster means the sample is less crystalline and self-adhesion is less significant.

The heat flow rate was found **by** taking the slope of the **DSC** curves as they begin to cool from **200"C.** The change in heat flow is different among different colors of PLA filament. Cooling liquid semicrystalline polymers very quickly makes them more amorphous and cooling liquid semicrystalline polymers very slowly makes them more crystalline. Orange filament and yellow filament tend to peel off the raft significantly easier than white filament. This can be explained **by** the heat flow rates in table **7.** The yellow PLA is cooling nearly twice as fast as the white PLA. **A** scoring system that ensures all PLA filament colors are calibrated equally well is needed to expand this concept to all colors. Figure 14A-14E do look like they have more of a slope than traditional **DSC** curves which explains why these slope values are fairly close to zero.

3.5 Delta Calibration Test:

There were five variables tested during the screening design experiment for dimensional tolerance **- ^a** measure of how accurately the NVPro will print a length CADed to be a particular length. **If** my **STL** says the NVPro should print a 10 mm **by** 10 mm **by** 10 mm cube but the z direction is off **by** 2 mm then it has poor dimensional tolerance. The variables used in the initial test were: extrusion multiplier, perimeter acceleration, perimeter speed, and perimeter extrusion width percentage. The screening design process found that external extrusion width and perimeter speed were the most important variables. **A** screening design process is immensely helpful because **3D** prints take time. Assuming **I** want a low, medium, and high setting for each of these four variables, that would mean **I** would need to budget time for **34** or 81 prints. It takes about **3** hours for a delta test part to print so that's around 24o hours. However, with a fractional factorial design process we can cut the number of prints down to a low **¹⁸-** just 60 hours.

The delta test was a test for calibrating dimensional tolerance **-** testing to see how closely a length CADed to be length Xmm is to the printed length. **A** pareto plot was designed in order to determine which settings have the biggest impact on dimensional tolerance. The variables tested were: extrusion multiplier, perimeter acceleration, perimeter speed, and perimeter extrusion width percentage. The extrusion multiplier controls the extrusion flow rate, and is given as a factor, e.g. **1** means ioo% and **1.5** means **150%;** perimeter acceleration is the acceleration of the extruder during the perimeters, so the outer layer of the print; and perimeter speed is the speed of the extruder; and perimeter extrusion width percentage controls the extrusion flow rate on the perimeter. The data behind the scoring used here can be seen in appendix F and the process is described in section **2.3** of materials and methods. The pareto plots, organized **by** each settings of low, medium and high value, can be seen here:

Figure **15A.** Pareto Plot for Extrusion Multiplier. Each box represents **E** multiplier values of 0.8, **1** and **1.2** and has an x axis where B represents blue, W represents white, Y represents yellow, **0** represents orange, and R represents red. The scores for each color are moderately different for the same settings which means extrusion multiplier is moderately dependent on color.

Figure **15B.** Pareto Plot for External Perimeter Extrusion Width (EPEW) Percentage. Each box represents EPEW percentage values **of 110%, 130%,** and **150%.** The scores for each color are different under the same settings, particularly speeds **of 150%,** which means EPEW is dependent on color.

Figure 15C. Pareto Plot for Perimeter Acceleration. Each box represents accelerations of 100 m/s², 300 m/s², and 500 m/s². The scores for each color are moderately different for the same perimeter acceleration which means perimeter acceleration is moderately dependent on color.

Figure **15D.** Pareto Plot for Perimeter Speed. Each box represents perimeter speeds of 60 mm/s, **130** mm/s, and **140** mm/s. The scores for each color are significantly different for the same perimeter speed which means perimeter speed is dependent on color.

All of these pareto plots are scaled based on the score **-** a measure of the relative quality. To determine which variables are the most statistically significant, you look at the graphs **by** variable and choose based on how uneven the bars are across the color axis of the plot. Based on these pareto plots it seems the most quality dependent variables are EPEW percentage and perimeter speed. However, the EPEW percentage values are high relative to the calibration done in the Zeta calibration which could potentially mean the pareto plot is inflating the importance of the EPEW percentage. The calibration process is outlined in alpha and the same method would be used for dimensional tolerance but with a different scoring system and different settings **-** EPEW percentage and perimeter speed. **I** would expect there to be a relationship between crystallinity and the EPEW percentage of the dimensional tolerance. As crystallinity increases the torque required to extrude goes up because the polymer chains cannot align themselves as easily because of the limited mobility of interchain secondary bonding. The detail in the features of this calibration test are dependent on how much PLA is extruded. For example, a male feature that has been over-extruded will have a larger feature size than what the **STL** says it should be and would receive a lower score. Since higher crystalline materials require more torque to extrude it makes sense that a high crystalline material would be under-extruded under the same settings as a low crystalline material. To balance this, an increase in the EPEW percentage is needed. Along those line, a lower crystalline material would need a lower EPEW percentage because it over-extrudes. This is also balanced out **by** perimeter speed. Extruding equal volumes of PLA slowly across the perimeter increases the amount of PLA extruded as compared to a fast perimeter speed.

3.6 Zeta Calibration Test:

There were five variables tested during the screening design experiment for surface roughness: extrusion multiplier, perimeter acceleration, perimeter speed, and perimeter extrusion width percentage. Because of time issues, **I** was able only to do multiple rounds with orange and red. I chose orange and red because they have very different percent crystallinity and qualitatively orange PLA gives higher quality prints and red PLA gives lower quality prints. The first round data for all PLA colors can be found in appendix **G.** The first and second rounds for red and orange are in tables **8-13** below:

Table **8.** Settings for the Round One Zeta Test for Red and Orange PLA. The external perimeter extrusion width (EPEW) percentage controls the amount of material extruded for the outermost layer of the **3D** printed part. The perimeter speed controls the speed of the extruder as it prints the outermost layer of the 3D printed part.

Table **9.** Orange PLA Scores for the Round One Zeta Test. L, M and H correspond to the settings values in table **8. A** score of **6** means the highest quality print of the set and a score **1** means the lowest quality print of the set.

Table **10.** Red PLA Scores for the Round One Zeta Test. L, M and H correspond to the settings values in table **8. A** score of **6** means the highest quality print of the set and a score **1** means the lowest quality print of the set.

Table 11. List of Settings for the Round Two Zeta Test for Red and Orange PLA. The external perimeter extrusion width (EPEW) percentage controls the amount of material extruded for the outermost layer of the **3D** printed part. The perimeter speed controls the speed of the extruder as it prints the outermost layer of the **3D** printed part.

Table 12. Orange PLA Scores for the Round Two Zeta Test. L, M and H correspond to the settings values in table **11. A** score of **6** means the highest quality print of the set and a score **1** means the lowest quality print of the set.

Table **13.** Red PLA Scores for the Round Two Zeta Test. L, M and H correspond to the settings values in table **11. A** score of **6** means the highest quality print of the set and a score **1** means the lowest quality print of the set.

Based on calibration data from the **NVBOTS** engineering team, the most important setting for surface finish is external perimeter extrusion width (EPEW) percentage and perimeter speed. Therefore Zeta calibration doesn't have an accompanying pareto plot like the Alpha and Delta tests. Red PLA calibrated in the second round had an EPEW percentage **of 95%** and a speed perimeter of **100** mm/s, and orange PLA in the second round calibrated had an EPEW percentage **of 95%** and a perimeter **90** mm/s. These calibrated values make sense in the context of the material properties of orange and red PLA. The EPEW percentage and perimeter speed are very related to the flow rate of extruded material. High EPEW percentage and low perimeter speed both result in more extruded material. During extrusion, the temperature of the polymer is over the glass transition temperature which means the polymer chains are free to move around and organize themselves into crystalline domains. When being extruded, polymers that are **highly** crystalline require more torque to extrude because polymer chains have to align and densify in order to go through the aperture of the extruder. Both calibrated red and orange PLA had EPEW percentage settings **of 95%.** Orange PLA filament has a higher percent crystallinity **(12.1%)** and a calibrated perimeter speed of **90** mm/s and red PLA filament has a lower percent crystallinity **(8.8%)** and a calibrated speed of **100** mm/s. At an equal EPEW percentage to red, Orange *PLA* filament requires a lower perimeter speed because it is more crystalline and needs the extra push to extrude an equal amount of PLA.

4- **Conclusion & Futurc Work:**

3D printing is **a** hot topic in manufacturing and a truly useful tool, but it has limitations. Print quality properties **-** like raft peelability, dimensional tolerance and surface roughness **-** are hard to calibrate perfectly. Calibrating can theoretically be explained **by** material properties but it's not always simple. There are steps **3D** printer users or manufacturers can take to make their colored PLA prints better. **A** solution likely more accessible to major manufacturers **-** like Quantum3D **-** could be annealing. Filament manufacturers should anneal their spools post extrusion to increase the percent crystallinity of colors like red and blue **(8.8%** respectively **10.2%)** to the percent crystallinity of colors like yellow and orange **(12.1%** respectively **12.1%).** Having relatively the same percent crystallinity in each color would mean that many of the material properties would be similar as well. Crystallinity related to thermal, mechanical and chemical testing done in this thesis. Annealing a filament spool would require heating the spool between the glass transition temperatures and the melting temperature of PIA (between **40*C-50'C** and $160^{\circ}C \cdot 180^{\circ}C$, allowing the polymer chains to flow freely and organize themselves into crystal domains. **If** the cooling is controlled during this time, the percent crystallinity could be the same across all colors of PLA filament. **If** cooled more slowly, the percent crystallinity will get higher since this allows time for the polymer chains to arrange themselves in ordered lamellar domains. If all PLA colored filaments had the same crystallinity, the similar crystallinity across color would mean many properties would be similar across color as well. Printing different colored PLA prints all under the same settings will not give you very different levels of quality parts.

The more average user can calibrate the settings on their **3D** printer with respect to each color. Orange and yellow PLA filament should have their extrusion multiplier settings increased because of their high percent crystallinity **-** with the NVPro there was success in lowering the perimeter speed which meant more extruded PLA. The extruder temperature for the first layer $-$ the layer printed after the raft $-$ was also turned up from **190C** to **195C** and **198C** for red PLA and white PLA respectively.

For future work, more samples would give more confidence to the data. The FTIR analysis was only one spectrum for each color, rather than having an average of spectra. The uniaxial testing and the **DSC** were both more robust and had multiple runs for averages, or for determining trends. For chemical testing, **I** would run a raw piece of PLA as well. Comparing the spectrum across colors is an effective way to

illustrate the subtle differences in additives, but it would be interesting to see the effect of PLA's organic chemistry as you compare an FTIR spectrum of the PLA pellets to a spectrum found in polymer libraries. For thermal testing, there are two additional runs that **I** would do. First, **I** would run a **DSC** on colored PLA that has been printed **-** so cutting a small piece off a print. It would be interesting to see if the **DSC** curve of this printed colored PLA matched the **DSC** curve for the second thermal cycle. **I'd** expect the curves to not be the same. Although the polymer is reheated during extrusion, the extrusion process would undo any of the annealing done during this cycle. I'd also like to buy commercial raw PLA filament. It would be interesting to compare the **DSC** curves of raw PLA pellets to raw PLA filament to see the effects of the manufacturing process or to see if manufacturers add the same additives manufacturers do in colored PLA filaments, but just not dyes. Raw PIA had the lowest crystallinity so it would be interesting to find out if the raw PLA filament would have additives that increased its crystallinity to be on order with the colored filament or if the percent crystallinity would just go up from extrusion before going on a spool. Subtracting the raw PLA filament spectrum from any colored PLA spectrum would leave only the signal responsible for dyes. For the delta test, **I** would like to implement the calibration process done during the alpha test to see if there's a relationship between dimensional accuracy and the amount of material extruded. The amount of material could be a function of the crystallinity of the colored PLA, the external perimeter extrusion width (EPEW) percentage, and/or the perimeter speed. For the zeta test, **I** would like to develop the **STL** further so there are more features that would define a high quality surface finish. I would also like to incorporate more settings because EPEW percentage and perimeter speed tend to control the surface quality of features better than the surface quality as a whole **-** like large planar areas of a print. Lastly, I would like to anneal spools before they are put on the **3D** printer to see if that can control print quality **-** specifically annealing and cooling slowly PLA filament like red which aren't as crystalline. **If** these get explored, having the capability to produce high quality **3D** printed parts reliably one of additive manufacturing's biggest weaknesses **-** could be a lot more accessible.

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6. Appendices:

6.1 Appendix A:

Figure **A.** Screenshot of the web interface.

6.2 Appendix B:

Here is a summarized table of the thermal **DSC** data for the second thermal cycle:

Table B. Thermal Properties of PLA color from the second **DSC** scan. The PLA colors and raw PLA are descending **by** percent crystallinity. The yellow, blue, orange, and red samples all had no crystallinity peaks which means that the polymer is now amorphous instead of crystalline.

6.3 Appendix C:

Here are stress-strain curves for each PLA color which were used in part to find the values in table 2:

Figure **C-A.** Tensile Stress-Strain Curve for Orange PLA. The stress, in MPa, is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain, which is dimensionless, was found **by** dividing the extension **by** the body length of the dog bone **-** 33mm. Orange had the highest yield stress at 45.1 ± 0.3 MPa.

Figure C-B. Tensile Stress-Strain Curve for Yellow PLA. The stress, in MPa, is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain, which is dimensionless, was found **by** dividing the extension **by** the body length of the dog bone **-** 33mm.

Figure **C-C.** Tensile Stress-Strain Curve for Grey PLA. The stress, in MPa, is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain, which is dimensionless, was found **by** dividing the extension **by** the body length of the dog bone **-** 33mm.

Figure **C-D.** Tensile Stress-Strain Curve for Blue PLA. The stress, in MPa, is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain, which is dimensionless, was found **by** dividing the extension **by** the body length of the dog bone **- 33mm.**

Figure **C-E.** Tensile Stress-Strain Curve for White PLA. The stress, in MPa, is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain, which is dimensionless, was found **by** dividing the extension **by** the body length of the dog bone **-** 33mm.

Figure **C-F.** Tensile Stress-Strain Curve for Red PLA. The stress is found **by** dividing the load **by** the cross sectional area of the thinnest part of the dog bone. The strain was found **by** dividing the extension **by** the body length of the dog bone - 33mm. Red PLA had the lowest yield stress at 32.7 ± 1 MPa.

Table **C.** Mechanical Testing Table. The dimension lengths, the cross sectional areas, the gauge length, and the yields are listed here. The dimensions in column 2 and **3** are inflated **by** 0.47 mm which is accounted for in the cross sectional area. The gauge length is from the dogbone being a type IV dogbone **by ASTM** standards. The yield is corrected **by** adding whatever the load was after the fracture **-** which should be zero but isn't because of the weight of the Instron.

6.4 Appendix D:

Figure **D.** Screening Design Pareto Plot for Alpha Calibration Test. This Pareto Plot was done **by** Paul Burke to figure out which of the three variables were most dominant to save time printing. **C,** or first layer extrusion width, was found to be the most statistically significant variable.

6.5 Appendix E:

Gray:

White:

Red:

Yellow:

Orange:

Table **E-A.** Tables for Calibrated Alpha Tests.

Offset and FLEW% Non-linear Relationship with Mechanical and Thermal Tests:

Table E-B. Offset and FLEW% Non-linear Relationship with Mechanical and Thermal Tests. It doesn't seem there's a simple proportional relationship between the alpha calibration settings.

6.6 Appendix F:

Delta Test:

ROUND 1:

Table **F-A.** Settings for Delta Test and their Values.

Table F-B. The Settings for Each Print for the Delta Test.

6.7 Appendix G:

Zeta Test:

Table **G-A.** Settings for the Round One Zeta Test for **All** PLA Colors. The external perimeter extrusion width (EPEW) percentage controls the amount of material extruded for the outermost layer of the **3D** printed part. The perimeter speed controls the speed of the extruder as it prints the outermost layer of the **3D** printed part.

Table G-B. Grey PLA Scores for the Round One Zeta Test.

Table **G-C.** White PLA Scores for the Round One Zeta Test.

Table **G-D.** Blue PLA Scores for the Round One Zeta Test.

Table **G-E.** Yellow PLA Scores for the Round One Zeta Test.

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