CIS/CEN 4914 Senior Design - Advisor Scoring Form/Questionnaire Semester (circle one): FALL SPRING SUMMER Year: 2020 Student Name Michael Gordon UF-ID[5:8] 4199-1563 Part 1. Student's Project. Please score student's effort numerically. Do not use "A", "B", "C", etc. Note that the Quality of Final Report is on a scale of 20 points, not 10 points. Completeness of Project " 10/ 10 points **Complexity** of Project <u>" 10</u>/ 10 points **Quality** of Results " 10/ 10 points " 19/ 20 points **Quality** of Final Report **■ NOTE:** <u>20</u>POINTSMAX, NOT10PTS Part 2. Student's Performance. Please circle a number (1 = poor, 2 = fair, 3 = adequate, 4 = good, 5 = excellent) in response to the following questions about your student and your interaction with him/her either individually, or in a design group. Note: Circling N means that question is not applicable, or that you don't know the answer: 1. Applied knowledge of math, science, or engineering: 1 2 3 4 5 N 2. Designed/conducted experiments or organized/processed data: 1 2 3 4 5 N 3. Designed systems, components or processes to meet needs: 1 2 3 4 5 N 4. Functioned on multidisciplinary team or interacted well with you: 1 2 3 4 5 N 5. Was responsible, diligent, and ethical on this project 1 2 3 4 5 N 6. Used techniques, skills, and tools of modern engineering: 1 2 3 4 5 7. Appeared to understand hardware-software interaction: 1 2 3 4 5 N Advisor Name Frank J Bova Date 4/21/2020

Thank you for advising a Senior Design project!

Advisor Signature

This project required the student team to understand the underlying objective, search for existing solutions and if no solution could be found create the required framework. The initial approach brought together two teams of experts. One team with the knowledge of the medical problem at hand and a second with the knowledge requisite for providing a computational solution. The first team was also responsible for providing a pathway to obtain medical images. These images were to be used for both development, testing and if necessary training of the algorithms. Unfortunately this team hit some roadblocks in developing the required permissions to access in-house patient data and for the most part disengaged midway through. The one exception was the team leader who continue to assist through the project. The programming team was able to access images through open source databases and, while not optimal, was able to utilize these open source resource to make significant progress on a solution.

The CISE design team was able to bring together resources that allowed the input of a patient's DICOM formatted MRI brain scan, provided a pathway to fuse a standardized and labeled deformable brain atlas to the individual patient's brain and provide a process for an end user to display these results on an iPhone. As with any project of this complexity the team investigated may potential pathways. The team did have the insight to discard the dead ends and to continue to move forward. The final solution, outlined in their reports, required the development of several servers and linked processes. The solution presented utilizes available open source systems brought together by the student's unique and insightful software. The team achieved this solution on their own with only input on how the various proposed pathways would or would not meet the project objectives. The students should be proud of this body of work. I very much enjoyed working with the team.

Thanks for the enjoyable project.

Frank J Bova Ph.D. FAAPM, FACR, FAIMBE Albert E. and Birdie W. Einstein Professor of Computer-Assisted Computed Neurosurgery www.Neurosurgery.ufl.edu/bova

This questionnaire will help us assess how we are improving Senior Design course with respect to your achievements and our accreditation requirements. <u>Completion is mandatory</u> for all students enrolled in CIS/CEN 4914, beginning Fall 2005. Items in brackets ([]) are for faculty only.

Please use MS-Word to fill in your questionnaire, print it out, and make it the LAST PAGE of your Final Report (does not count toward FinRpt 11-page maximum length). **NO HANDWRITING PLS**

Your Name: Michael Gordon UFID[5:8]: 1563 Major: CSE

UF-Online Student? No

1. What was your Senior Project or CISE Design 2 project about? (1-2 sentences)

Answer: This CISE design project focused on the transformation of a series of 2D DICOMs of the brain to a segmented 3D model. This model would then be rendered on the iPhone

2. What impact do you think a project or topic like this has on your responsibilities re: engineering in particular, and on society in general? (2-3 sentences) [AB Out f)]

Answer: This topic requires to responsibly design a secure system as the patient data is sensitive. This is a key ethical responsibility in engineering.

3. What impact does your project, or research in the area of your project, have on the global community in general, and on our society in particular? (1-3 sentences) [AB Out h)]

Answer: This project could be put in the hands of doctors to improve communication between doctors and patients.

4. How important would it be to continue learning about engineering, upgrading your skills throughout your lifetime of employment? Why is this important? (1-2 sentences) [AB Out i]

Answer: Lifelong learning is valuable to me. I believe that in my career I will have to learn new frameworks and programming languages all the time. Being able to be flexible and prepared to learn will help with this.

5. What contemporary issues in society and computer science/engineering do you see as being related to your project, or its topical area? (1-3 sentences) [AB Out j]

Answer: Data and health privacy are key elements that relate to this project. The segmented brain is useful for education purposes.

A Neurosurgery Patient Anatomy Application

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Abstract

Neuroimaging has allowed for doctors to diagnose patients and make decisions on treatment. Often patients must make life-altering decisions on treatment options. Due the nature of cancer in the brain, the side effects of a treatment option can vary. Doctors do their best to provide patients with the information they need to make these decisions. CT and MRI scans effectively communicate to medical experts what is going on in the brain, but it is not as clear to the average person.

With all this in mind, we decided to produce a pipeline to segment and visualize a patient's brain. This visualization can be presented to the patient to better help explain their condition and give them more information to make decisions on treatment options. In this report, we will discuss how set up server to process the brain, used FreeSurfer to segment the brain and used VTK to render it on an iPhone.

1.Introduction.

Neuroimaging technology is frequently used by medical experts to diagnosis and treat patients. Magnetic Resonance Imaging (MRI) and computed tomography (CT) scans allow for visualization of patient's brains. The brain scans can be used to spot abnormalities in the brain and guide neurosurgeons when deciding treatment options. However, these scans relay on medical expertise to understand. This report will summarize the methods used to transform 2D slices of a brain scan into a 3D volume. The software developed provides an interface for doctors to submit MRI T1 scans to go through the transformation. The results can then be visualized on an iPhone and displayed to patients.

1.1 Problem Domain.

Visualization of medical data is an area of high interest in computer science and neuroscience. 2D slices of MRI scans can be converted to 3D volumes. These 3D volumes can be displayed on a computer. Our pipeline aims to produce a segmented 3D volume from a series of 2D DICOM files. With that being accomplished we can visualize a patient's brain.

1.2 Previous Work (Literature Search).

In 2002, Insight Segmentation and Registration Toolkit (ITK) was released as an open source application development framework.[1] This software aids the medical community in developing tools that preform image segmentation and registration. Image segmentation is the process of breaking up an image into multiple segments.[2] These segments are often critical underlying structures in the image. Image registration is the process of taking information from several images and combining them.[3] In the context of our brain scans, a CT scan produces a series of DICOM files. Each of the DICOMs are a single slice of the brain scan. These images need to be combined via registration and then segmented anatomically in order to be visualized in 3D.

ITK assist with this process, but it does not perform a visualization. For that there exists the Visualization Toolkit (VTK). VTK is an open source framework that assisting can be used for developing 3D graphics, preforming image processing and preforming scientific visualization.[4] VTK provides a rendering abstraction layer for OpenGL. This allows for one to easy read and render different formats of data. VTK can easily render DICOMs and NIFTIs.

In our research we encountered two interesting pieces of software that would assist us in our challenge. First, we encountered quickNAT, this uses a convolution neural network (CNN) to preform automatic segmentation.[5] This software runs fast, the paper suggests the segmentation can be done in 20 seconds. However, the software requires on training data and it was pretrained on healthy brains. We would need to train the CNN with a large sample of brains with tumors.

The second software we found was FreeSurfer, an open source software suite for processing and analyzing brain MRI images.[6] FreeSurfer provides many tools to process brain scans. Key features that we need include skull stripping, image registration, sub-cortical segmentation, cortical segmentation and cortical surface reconstruction. The segments produced are too detailed for our needs.

From what we learned about these toolkits described, they are all very complicated and are the results of years of development. We decided it was best to make use of the existing frameworks from VTK and FreeSurfer and mold them to our needs.

2. Our Solution.

Considering the fact, we did not have access to a large number of scans with brain tumors, we decided against using a CNN. Instead we used FreeSurfer to do the intensive processing needed to produce our 3D Brain volume. Since FreeSurfer gives a wide variety of segments, we decided it was a good idea to group common structures into a single segment. With the file processed in a way we desired, we then focused on the task of rendering on the iPhone. We used VTK to achieve this goal. Lastly, we set up two servers, one to preform processing of data and the other to serve the data to the phone.

2.1 Using FreeSurfer.

FreeSurfer is a vast program that allows for all sorts of processing to be done on the brain. Our main interest was brain segmentation. In order for to use FreeSurfer, a file in the NIFTI format is needed. This file must be a weighted T1 scan. Since the pipeline was set up using Python, a small package dicom2nifti allowed for converting a series of DICOM files directly into one NIFTI. Using the recon-all command provided, this initializes a pipeline (pipeline stages shown in Appendix a).

The key steps in this pipeline are as follows: skull stripping, non-linear registration. volumetric labeling, intensity normalization, white matter segmentation, surface atlas registration, surface extraction and gryal labeling. [7]

Skull stripping removes the skull from the scan as it is not a point of interest. With this out of the way the volumetric labeling can begin. The non-linear registration stage preforms registration. This registration takes care to accurately model deformations in the brain. Sub-cortical brain structures are labeled based on an atlas provided in FreeSurfer. Intensity normalization homogenizes the signal intensity of the white and grey matter to distinguish the two tissue types. White matter is then segmented. Surface atlas registration maps the subject's mesh to a sphere. This data is warped so it be be aligned with the template data in FreeSurfer. Once this sphere is generated, it can be used to preform surface extraction which provides us with a 3d surface of the subject's brain. Lastly, gryal labeling gives us the surface parcellation.

At the end of this pipeline the file aparc.a2009s+aseg.nii that contains a 3D segmented brain is obtained..

2.2 Our processing.

Additionally, we decided to implement a method to reduce the number of structures to fit our needs. This processing is done by sampling using a lookup table provided by FreeSurfer and a look up table we created. We do a many to one mapping of the voxel data from the FreeSurfer table value to a value on our table. This effectively merges the segments for us.

2.3 VTK on iOS.

After obtaining a volume, rendering of the brain was possible. In order to do this VTK 6.3 on iOS was used. VTK allowed us to set up a renderer and add volumes to that renderer. First, we tried adding each brain segment as its own volume, allowing us direct control over the opacity and color. Since we had many segments, this was difficult for the phone to handle. We decided we must use one NIFTI and choose the colors for segment via a color transfer function. Each voxel has an associated value, and we can map the data of each voxel to a specific color. Using our label map, voxels were set to particular values to correspond to particular labels. We mapped each of those values to a color. Now that all of our segments were colored, we needed to add for a way to interact with the volume. We decided to add buttons that would allow for the 'adding' and 'removing' of segments. The button would make the segment disappear by changing the opacity of the segment to 0. Wireframes of the app can be seen in appendix B.

2.4. The Servers.

In order to facilitate the transfer of data to the phone, two servers were set up. One for serving the results of processing to the phone and another for receiving requests to process data.

The processing server listens for POST requests that upload an archive file containing DICOMs. These DICOMs are converted to niftis and sent to the FreeSurfer pipeline. After that our processing is done (as outlined in 2.2). After this the segmented brain is ready to be sent to the medical server. The medical server can also make requests to get the status of a processing study. By checking the status of the processing, the physician can get data about whether the data sent was adequate, if processing has started, and if the data is a available it can be sent to the medical server.

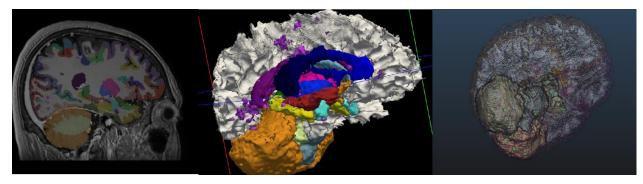
Since recon-all can take several hours and program crashing is possible, great care is taken to keep track of the processing stage of recon-all. By accessing the log file, the server can restart recon-all at the appropriate stage in the pipeline. Studies can be processed in parallel. Following the guidelines on FreeSurfer's website, the server is set up to run several recon-all's.[8] The limit is set to 3GB per process and 1 core. If a lot of cores are available, multiple cores can be mapped per recon-all process. Both servers communicate uses API tokens for authentication.

The file server is set up to accept logins from the client. After logged in the client can request a list of studies it has access to. Using GET requests, the client can request a study. If the data has been processed, the 3d volume can be sent to the brain and rendered on the phone. POST requests to this server can be made to add a new study and upload dicoms to be processed. These DICOMs will be sent to the processing server. New data can be submitted for a study in the case that invalid data was submitted before.

3. Results.

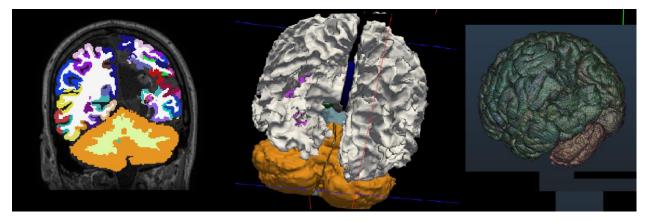
Our pipeline successfully produced several segmented brains. Here are two of our sample data visualized. This data comes from The Cancer Imaging Archive.[9] On the left is the data visualized using FreeSurfer's freeview. On the right is our result visualized using VTK.

Subject 1:



Here we show a slice of the original series with the FreeSurfer segmentation on top. Then is a 3d view of the brain from Freeview. The last image is our final result displayed using VTK. This segmentation took approximately 9 hours.

Subject 2:



This example seems particularly interesting as there is a hole in the segmentation where an abnormality occurs. As can be seen that hole translates to the 3d models as well.

These scans took a significant amount of time to process. It turns out that large tumors are hard for FreeSurfer to process. In one scan the program ran for 30 plus hours and did not complete. It is advised that for these sorts of scans that the segmentation of the white matter be manually edited to correct these defects in order to produce a segmentation.

4. Conclusions.

Using the FreeSurfer pipeline, our team produced segment volumes for display on the iPhone. Overall, this was a very research heavy project. A lot of time was devoted to understanding the process of producing an accurately segmented brain. Knowledge of registration and segmentation techniques was required to know what pipelines best suited our needs. This project also gave us experience working with rendering 3d models. VTK provided an easy to use framework that allowed us to rapidly deploy our application.

In the future efforts can be re-directed towards using a faster segmentation pipeline. With approval from the IRB, access to many patient data could provide a CNN with the appropriate training needed to accurately segment cancer patient's brains.

Standards and Constraints

Standards: All medical images start in the DICOM format and the NIFTI standard is required for Freesurfer. VTK 6.3 ,FreeSurfer 6.0, Python 3.8, and Django were used to deploy our application.

Constraints: The servers were developed to run on Ubuntu 18.04. The app was developed for iOS.

5. Acknowledgments

Special thanks to our advisor Dr. Frank Bova for supervising this project. His guidance and medical expertise were pivotal in allowing us to approach the problem. Thanks also goes to Kyle Scott for leading the project and providing additional medical knowledge. Thanks to Dr. Tina Kapur and Bruce Fishel from Havard for putting us in the right direction with FreeSurfer.

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7. Appendices

Appendex A – FreeSurfer Processing Pipeline

Autorecon Processing Stages

- Motion Correction and Conform
- NU (Non-Uniform intensity normalization)
- Talairach transform computation
- 4. Intensity Normalization 1
- Skull Strip
- EM Register (linear volumetric registration)
- CA Intensity Normalization
- 8. CA Non-linear Volumetric Registration
- Remove Neck
- LTA with Skull
- CA Label (Volumetric Labeling, ie Aseg) and Statistics
- 12. Intensity Normalization 2 (start here for control points)
- White matter segmentation
- Edit WM With ASeq
- Fill (start here for wm edits)
- Tessellation (begins per-hemisphere operations)
- 17. Smooth1
- 18. Inflate1
- 19. QSphere
- Automatic Topology Fixer
- 21. Final Surfs (start here for brain edits for pial surf)
- 22. Smooth2
- 23. Inflate2
- Spherical Mapping
- Spherical Registration
- 26. Spherical Registration, Contralateral hemisphere
- Map average curvature to subject
- 28. Cortical Parcellation Desikan Killiany and Christophe (Labeling)
- 29. Cortical Parcellation Statistics
- 30. Cortical Ribbon Mask
- Cortical Parcellation mapping to Aseg

Appendex B – Technology Transfer

We intend to transfer all code over to the control of Dr Bova. It is advised that both servers be setup on separate computers as the processing server will require a lot of resources.

The processing server can be set up by extracting the processingServer directory to a desired location. On a Linux machine, FreeSurfer version 6 and python 3.6 with pip is required to be set

up on this machine. Running pip install -r requirements.txt will install all other necessary dependencies. The server can be configured by running python setup.py After configuration it is advised to set up a superuser and run the server. An access token must be set up through the /admin/ portal. This token should be stored in the medicalServer/token.py on the other server.

The medical file server is set up through the same process. Note this server only requires python 3.6 with pip. The token retrieved from this server should go in processingServer/token.py **8.Biography.**

Michael Gordon was born on March 20, 1996. He attends UF as a Computer Science major. He has experience working in C++, Java, Python, OCaml and JavaScript. His field of interest include operating systems, programming language development, and computer networking. Michael hopes to gain experience working in industry and to take that experience and start his own freelance programming company.