

Training Machine Learning Classification Models

Creating Real-Time Data Points of Medical Conditions

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Dr. Nikki-Rae Alkema, PT, DPT

- Licensed Physical Therapist (CA)
- Movement is medicine!
- Special interests: biomechanics, technology in healthcare

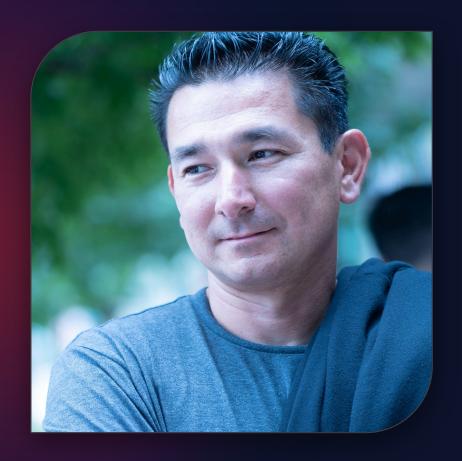




David vonThenen

- Are you Human or an Al?
- I want 5 Kubernetes
- Virtual Machines are Real
- Replacing Myself with Bots...
- Cloudy, cloudy,...
- There is storage for that!





Agenda

- Clinical Case Study
- How To: Build a Model
 - Characteristics to Code
 - Creating a Dataset Format
 - Live Demo!
- Multi-Modal/Model Problem Solving
- Q&A

A Common Thread







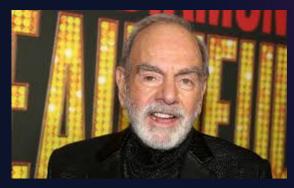




Alan Alda

Mohammed Ali

Ozzy Osbourne







Richard Lewis



Janet Reno



Brian Grant

Clinical Case Study

74M Presents with R Shoulder Pain

- Initial complaint:
 - Pain in R shoulder after a fall at home
 - Difficulty with reaching, lifting, pushing, and transfers
- Relevant contextual factors:
 - Recent balance issues
 - Caretaker for his ill wife



Was Shoulder Pain the Real

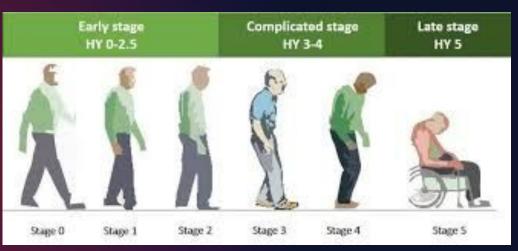
Problem?

- Not ONE but TWO problems
 - Rotator cuff tear
 - Balance and gait issues*
- Clinical observation
 - Using walker, slow gait, shuffling steps, neutral affect, soft voice, resting hand tremor



*Cause of fall → <u>undiagnosed</u> Parkinson's Disease

- Progressive movement disorder
- No cure
- Diagnostic tests uncommon
 - Mostly clinical diagnosis
 - Minimum criteria:
 - Bradykinesia, <u>plus</u>
 - Resting tremor, stiffness/rigidity, or postural instability

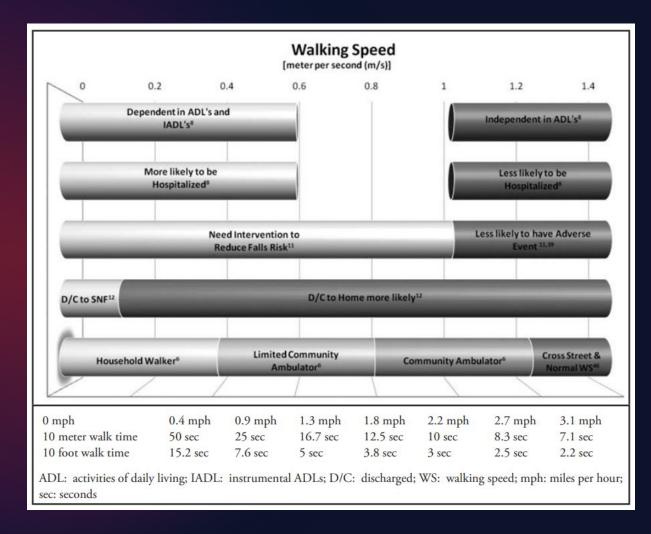


Why Parkinson's Disease?

- It's about...MOVEMENT!
 - Physical therapists are <u>movement experts</u>
 - Parkinson's Disease is a <u>movement disorder</u>
 - Movement analysis is pattern recognition
- Parkinsonian movement
 - Very characteristic manifestations of diagnostic criteria
 - Examples: 1) gait, 2) articulation/speech

What is Gait? 3,4

- Gait = an individual's unique pattern of walking
- Functionally important measure
 - Mobility, independence, fall-risk
 - Gait <u>speed</u> often considered the "sixth vital sign"
 - Predictive of mortality



Gait Analysis

- Normal Gait
 - Relative symmetry
 - Vertical alignment
 - Fluid motion
 - Biomechanics of the gait cycle within norms
 - Speed, cadence, step length, joint angles
- Clinical vs. lab analysis



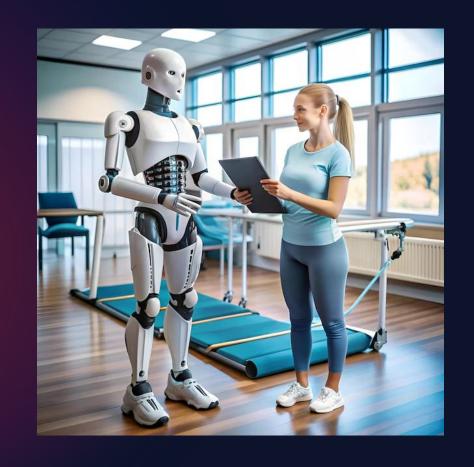
Parkinson's Gait 5

- Forwardly flexed posture
- Slow overall speed, small step length, changing cadence
 - Shuffling steps, freezing, turning "en bloc"
- Reduced trunk rotation and arm swing
- Tremors



A Trained Eye vs. Trained AI?

- PT training heavily emphasizes movement analysis
- Movement analysis is PATTERN RECOGNITION
 - So...a machine could do it?
 - (Un)popular opinion? → YES, and possibly better
 - Enter Al...



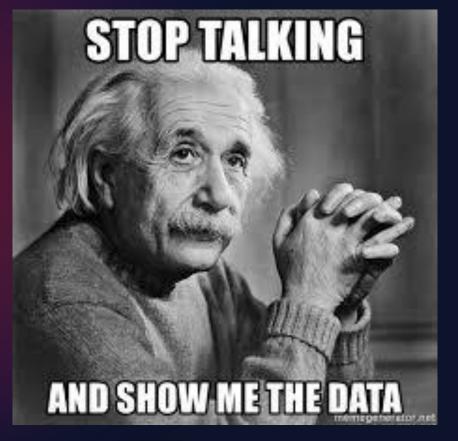
Translating Into a ML Model

How Would You Build This Model?

Show Me the Data!?!

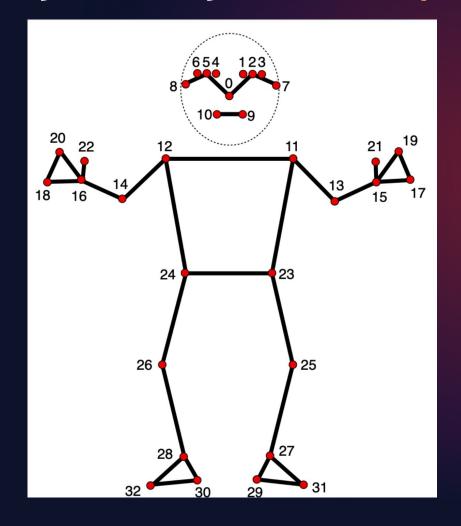
I Want to Build a Model, Where Do I Get the Data?

- You Have Access to that Data
 - Work in Medical Research
 - Work at a Medical Institution
 - Data Broker Google, Meta, etc
- That Isn't Me, Now What?
 - Look for Public Datasets
 - Kaggle, AcademicTorrents, etc
 - Get Creative!
 - YouTube, Instagram, TikTok, etc



Convert Video to Data

Google Al Edge: MediaPipe Pose Landmarker



- 0 nose
- 1 left eye (inner)
- 2 left eye
- 3 left eye (outer)
- 4 right eye (inner)
- 5 right eye
- 6 right eye (outer)
- 7 left ear
- 8 right ear
- 9 mouth (left)
- 10 mouth (right)
- 11 left shoulder
- 12 right shoulder
- 13 left elbow
- 14 right elbow
- 15 left wrist
- 16 right wrist

- 17 left pinky
- 18 right pinky
- 19 left index
- 20 right index
- 21 left thumb
- 22 right thumb
- 23 left hip
- 24 right hip
- 25 left knee
- 26 right knee
- 27 left ankle
- 28 right ankle
- 29 left heel
- 30 right heel
- 31 left foot index
- 32 right foot index

Convert Video to Data



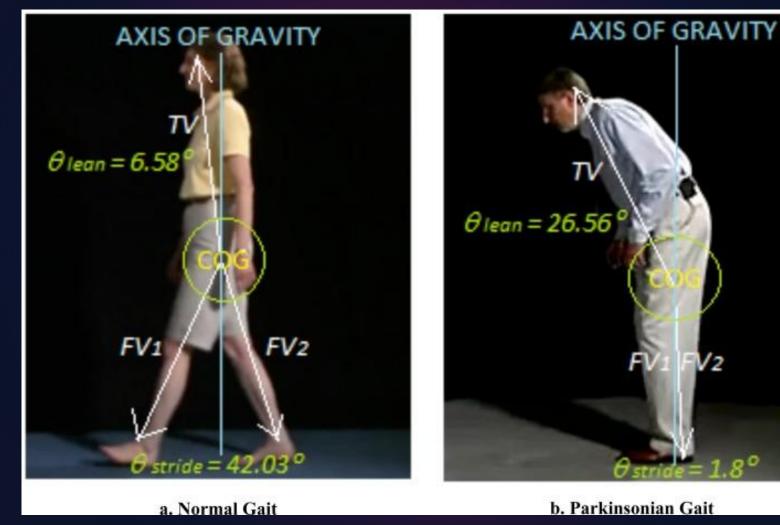


PoseLandmarkerResult: Landmarks: Landmark #0: : 0.638852 : 0.671197 : 0.129959 visibility : 0.9999997615814209 : 0.9999984502792358 presence Landmark #1: : 0.634599 : 0.536441 : -0.06984 visibility : 0.999909 presence : 0.999958 ... (33 landmarks per pose) WorldLandmarks: Landmark #0: : 0.067485 : 0.031084 : 0.055223 visibility : 0.9999997615814209 : 0.9999984502792358 presence Landmark #1: : 0.063209 : -0.00382 : 0.020920 visibility : 0.999976 : 0.999998 presence ... (33 world landmarks per pose)





Characteristics to Code

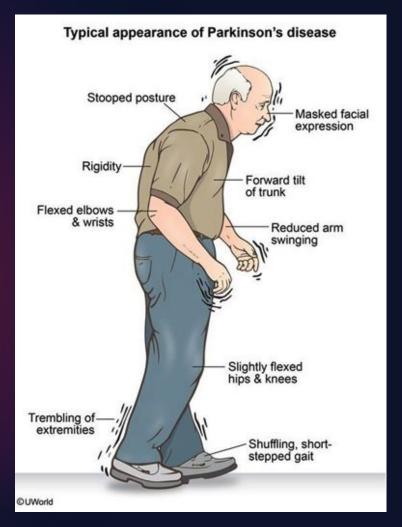






Creating a Dataset Structure

- Acceleration/Velocity of Landmarks
 - Reduce Movement, Rigidity, etc
- Body-Arm Angle (Elbow-Shoulder-Hip)
- Arm Angle (Shoulder-Elbow-Wrist)
- Leg Angle (Hip-Knee-Ankle)
- Step Angle (Knee-Hip-Knee)
- Step-Length



Code Walkthrough and Demo

https://youtu.be/nWr44ye_1pg

Multi-Modal/Model Problem Solving

Parkinson's and Speech

 Changes in tone, clarity, breathiness, facial emoting, gesturing, posture, enunciation (i.e. Alan Alda)



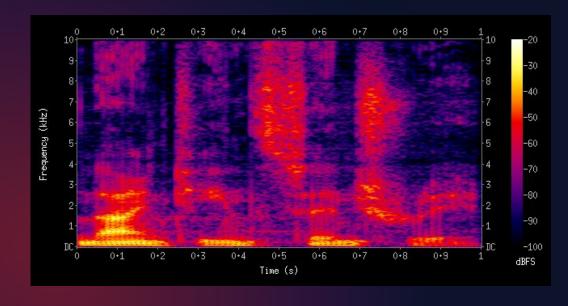
January 21, 2018
Screen Actors Guild Awards

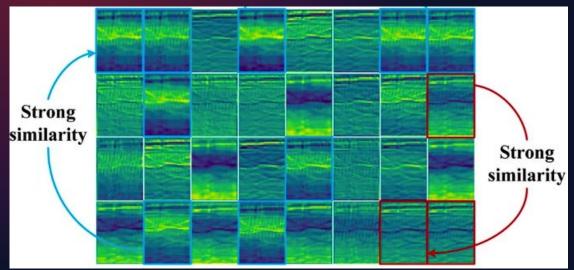


March 5, 2024
Everything Happens Podcast with Kate Bowler

Models for Audio Classification

- Classifying Audio
- Easier?
 - Select Phrase
- Better? (But Harder?)
 - Any Phrase
 - LARGE Dataset
 - Languages
 - Accents
- Gait + Audio + More...







Future of Al in Medicine

- Build All of the Models
 - Don't Rely on a Single Model for Analysis
 - Walk Like a Duck, Talk Like a Duck, Breathes... etc...
- Al is (and Will Continue) Changing Medicine
 - Tools to Improve Clinical Efficiency
 - Increase Access to Diagnostics and Treatment Interventions (i.e. Telehealth)
 - → Be Part of the Change...We Need You!

Presentation Resources

Medical Resources/Citations

- 1. McCormack, R. Understanding the Five Stages of Parkinsons. Parkinson's NSW. Accessed October 7, 2024. https://www.parkinsonsnsw.org.au/understanding-the-five-stages-of-parkinsons.
- 2. Yun, J. Movement Symptoms. Parkinson's Foundation. Accessed October 7, 2024. https://www.parkinson.org/understanding-parkinsons/movement-symptoms.
- 3. Middleton A, Fritz SL, Lusardi M. Walking speed: the functional vital sign. J Aging Phys Act. 2015;23(2):314-322. doi 10.1123/japa.2013-0236.
- 4. Fritz, Stacy PT, PhD1; Lusardi, Michelle PT, PhD2. White Paper: "Walking Speed: the Sixth Vital Sign." Journal of Geriatric Physical Therapy 32(2):46-9.
- 5. Moore, K. Trouble Moving or Walking. Parkinson's Foundation. Accessed October 7, 2024. https://www.parkinson.org/understanding-parkinsons/movement-symptoms/trouble-moving.

AI/ML Resources

[CLICK HERE] for All Material Contained in this Session [CLICK HERE]

Code with Instructions for:

- Part 1: <u>Processing Videos Using MediaPipe</u>
- Part 2: <u>Building a Parkinson's GAIT Model</u>
- Part 3: <u>Final Demo Used in this Presentation</u>

Other Resources:

- Deepgram Speech-to-Text: API and Docs
- Deepgram Text-to-Speech: API and Docs
- Google Edge Al: MediaPipe Project

Questions?

Thank You!

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