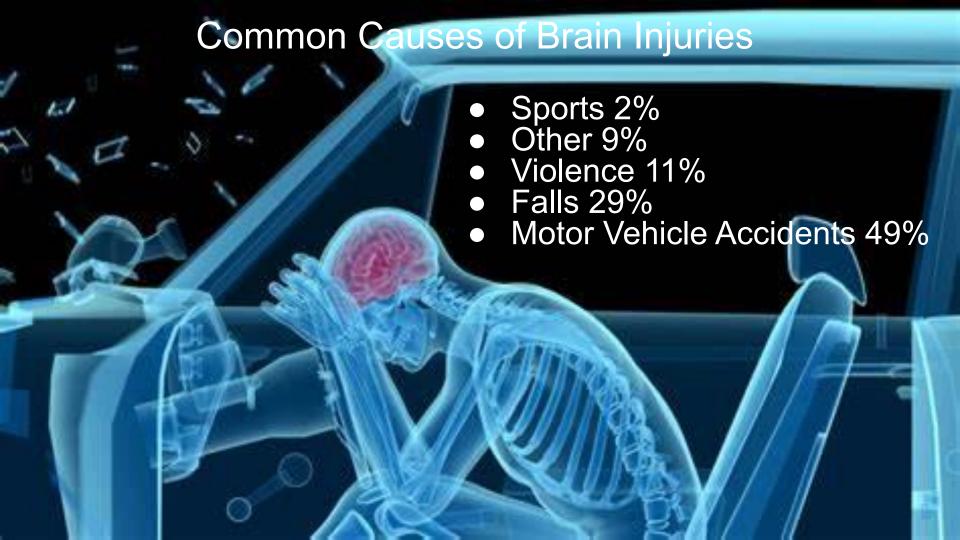


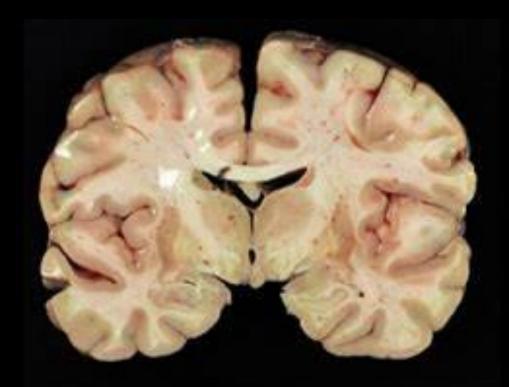
About Me

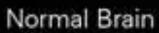
- Technical Writing
- Database Development
- Sandia National Labs/Department of Energy
- Data Science Deep Dive



How Serious is This?

- Approximately 50 million traumatic brain injuries (TBI) annually worldwide
- Can lead to physical disabilities and cognitive, emotional, and behavioral changes
- Risk factor for dementia and other chronic medical conditions

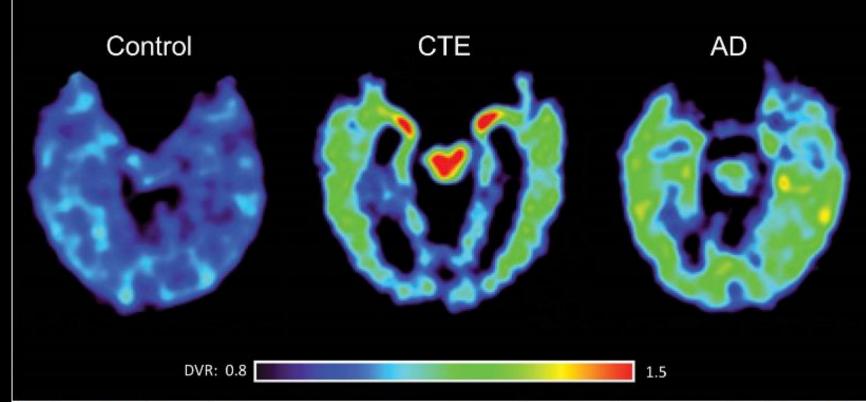






Advanced CTE

Source: Boston University Center for the Study of Traumatic Encephalopathy



Caption: Left to right, brain PET scans of healthy control; former NFL player with suspected chronic traumatic encephalopathy (CTE); and person with Alzheimer's disease (AD). Areas with highest levels of abnormal tau protein appear red/yellow; medium, green; and lowest, blue.

The Data



- The Traumatic Brain Injury
 Model Systems National Data
 and Statistical Center
 (TBINDSC) located at Craig
 Neuro-Rehabilitation Hospital in
 Englewood, Colorado
- Largest database in the world for traumatic brain injury
- Public use dataset does not contain any HIPAA identifiers

Tools















Initial Data Analysis

Two Datasets:

- Form 1
 - Collected upon intake
 - Includes subject history and demographic variables
 - Comprised of 18,679 rows × 343 columns
- Form 2
 - Longitudinal study
 - Follow-up data collected post-injury: 1, 2, 5, 10, 15, and every 5 years thereafter
 - 30 years of treatment outcomes
 - Comprised of 69,138 rows × 292 columns

Additional Data Sources

9 documents were reviewed from a curated list of 167 clinical publications from *Traumatic brain injury as a chronic disease: insights from the United States Traumatic Brain Injury Model Systems Research Program.* Lancet Neurol 2023; published online April 19, 2023

Traumatic brain injury as a chronic disease: insights from the United States Traumatic Brain Injury Model Systems Research Program



Kristen Dams-O'Connor, Shannon B Juengst, Jennifer Bogner, Nancy D Chiaravalloti, John D Corrigan, Joseph T Giacino, Cynthia L Harrison-Felix, Jeanne M Hoffman, Jessica M Ketchum, Anthony H Lequerica, Jennifer H Marwitz, A Cate Miller, Risa Nakase-Richardson, Amanda R Rabinowitz, Angelle M Sander, Ross Zafonte, Flora M Hammond

Traumatic brain injury (TBI) is a global health priority, associated with substantial burden. Historically conceptualised as an injury event with finite recovery, TBI is now recognised as a chronic condition that can affect multiple domains of health and function, some of which might deteriorate over time. Many people who have had a TBI remain moderately to severely disabled at 5 years, are rehospitalised up to 10 years post-injury, and have a reduced lifespan

Lancet Neurol 2023

Published Online April 19, 2023 https://doi.org/10.1016/ S1474-4422(23)00065-0

Article Categories

- General
- Sleep and Fatigue
- Employment
- Mood (Anxiety, Depression, etc.)
- Life Satisfaction

Variable Selection

Common features among articles:

Satisfaction With Life Scale (SWLS)

Four question evaluation where the patient rates satisfaction with life at the time of the follow-up

2. Patient Health Questionnaire (PHQ)

Nine question patient self-report used as a screening tool for depression

Question

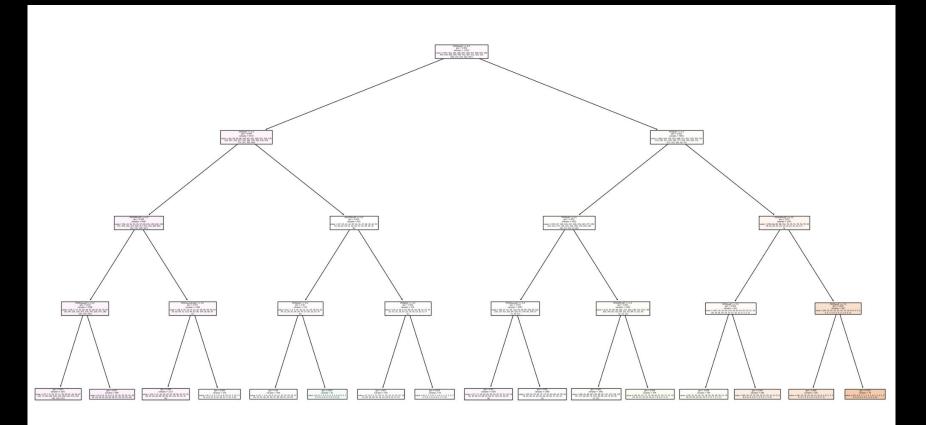
Can we predict a person's quality of life using Satisfaction With Life Scale (SWLS) and Patient Health Questionnaire (PHQ) scores?



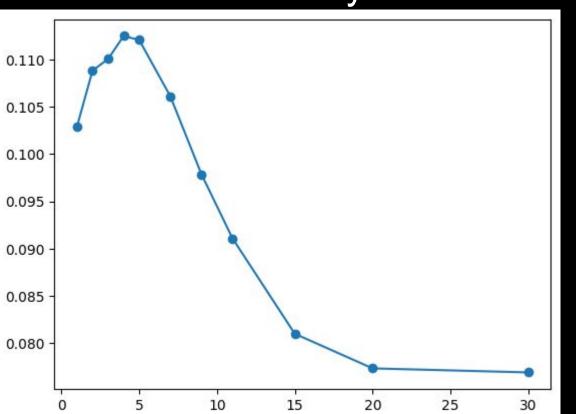
Exploring the Data

- Data Format
 - Comma Separated Values (CSV, XLS)
 - Statistical Package for the Social Sciences (SPSS, SAV)
- CSV and SAV data sets contain identical information, however SPSS data was imported to retain metadata relationships, which are not retained in the CSV format.

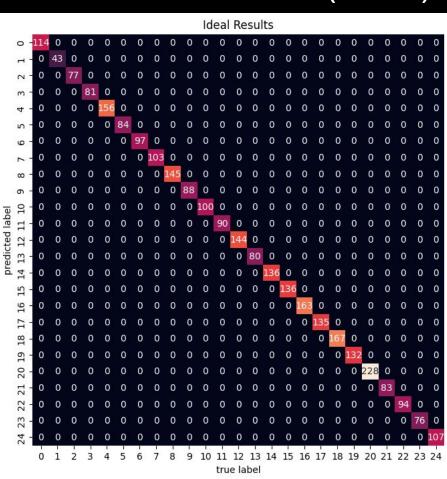
Decision Tree



Accuracy



Confusion Matrix (Ideal)



Confusion Matrix (Actual)

	Actual Results																								
0 -	55	15	23	28	26	21	22	21	19	14	12	7	11	6	8	9	6	3	2	1	4	1	2	2	4
н -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
7	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
m -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
4 -	35	16	27	26	65	21	32	36	45	16	31	21	31	21	25	27	32	19	20	18	27	15	7	6	2
ر د	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
9 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
7	0	0	0	2	0	0	0	1	2	0	3	0	0	0	0	0	1	1	0	0	4	2	0	0	1
ω -	5	1	5	4	13	8	10	4	10	9	5	4	5	3	8	7	5	7	7	7	6	3	3	1	(
ი -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
9 -	2	0	2	0	3	3	1	5	2	0	1	0	2	0	4	3	1	3	3	1	0	0	2	0	1
Π-	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
12	2	1	2	1	4	0	4	3	6	5	6	6	3	5	7	8	11	9	11	8	8	5	4	7	4
13	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
14	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
15	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
16	2	3	3	7	11	9	10	4	14	6	6	10	13	6	9	10	17	5	11	7	8	3	7	1	2
17	2	1	2	2	6	6	1	3	7	3	5	3	4	2	7	10	3	5	3	0	4	4	3	0	4
18	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
19		0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
20	11	6	13	11	28	16	17	26	40	35	31	39		37		10.00		-	110	90	167	50	66	59	8
21	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
22		0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
23	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	(
24	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
	Ó	i	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	2
												tru	e la	bel											

predicted label

Conclusion

- Satisfaction With Life Scale (SWLS) and Patient Health Questionnaire (PHQ) were selected from 292 variables, and evaluated to determine if quality of life of patients with traumatic brain injury can be predicted
- The model had an 11% accuracy rate, indicating that PHQ is a poor predictor of the impact of traumatic brain injury on quality of life (SWLS)

Next Steps

Analyze the data further:
 Further analyze the data by studying additional papers to identify the target and features used, and comparing statistical models to machine learning models to see if outcomes differ

Utilize PyCaret:

Identify additional features that may better predict Satisfaction with Life Scale (SWLS) to determine the optimal features and machine learning model



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Additional Sources/Publications

9 documents were selected from a curated list of 167 clinical publications from:

Supplement to: Traumatic brain injury as a chronic disease: insights from the United States Traumatic Brain Injury Model Systems Research Program. Lancet Neurol 2023; published online April 19, 2023

General

- <u>Traumatic brain injury as a chronic disease: insights from the United States</u>
 <u>Traumatic Brain Injury Model Systems Research Program</u>
- Supplement to: Traumatic brain injury as a chronic disease: insights from the United States Traumatic Brain Injury Model Systems Research Program. Lancet Neurol 2023; published online April 19, 2023

Additional Sources/Publications

Sleep and Fatigue

- <u>Factors associated with remission of post-traumatic brain injury fatigue in the years following traumatic brain injury</u>
- Factors associated with remission of insomnia after traumatic brain injury

Mood (anxiety, depression, suicidality)

- Prevalence of suicidal behaviour following traumatic brain injury: Longitudinal follow-up data from the NIDRR Traumatic Brain Injury Model Systems.
- A longitudinal study of major and minor depression following traumatic brain injury

Additional Sources/Publications

Employment

- <u>US Population Estimates of Health and Social Outcomes 5 Years After</u> <u>Rehabilitation for Traumatic Brain Injury</u>
- <u>Differences in employment outcomes 10 years after traumatic brain injury among racial and ethnic minority groups.</u>
- Unemployment in the United States after traumatic brain injury for working-age individuals: prevalence and associated factors 2 years postinjury

Life Satisfaction

- Refining understanding of life satisfaction in elderly persons with traumatic brain injury using age-defined cohorts: a TBI Model Systems study.
- <u>Trajectories of life satisfaction after traumatic brain injury: Influence of life</u> roles, age, cognitive disability, and depressive symptoms