

Title: Concussion and Risk of Chronic Medical and Behavioral Health Comorbidities

Running head: Medical and Behavioral Health post-concussion

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Abstract

Objective: While chronic neurological effects from concussion have been widely studied, little is known about possible links between concussion and long-term medical and behavioral comorbidities.

Methods: We performed a retrospective cohort study of 9,205 adult concussion patients, matched to non-concussion controls from a hospital-based electronic medical registry. Patients with comorbidities prior to the index visit were excluded. Behavioral and medical comorbidities were defined by ICD-9/10 codes. Groups were followed for up to 10 years to identify comorbidity incidence after a concussion. Cox proportional hazards models were used to calculate associations between concussion and comorbidities after multivariable adjustment.

Results: Concussion patients were 57% male (median age:31; IQR=23-48 years) at enrollment with a median follow up time of 6.1 years (IQR=4.2-9.1) and well-matched to healthy controls. Most (83%) concussions were evaluated in outpatient settings (5% inpatient). During follow-up, we found significantly higher risks of developing cardiovascular risks including hypertension (HR=1.7, 95%CI: 1.5-1.9), obesity (HR=1.7, 95%CI: 1.3-2.0) and diabetes (HR=1.8, 95%CI: 1.4-2.3) in the concussion group compared to controls. Similarly, psychiatric and neurologic disorders such as depression (HR=3.0, 95%CI: 2.6-3.5), psychosis (HR=6.0, 95%CI: 4.2-8.6), stroke (HR=2.1 95%CI: 1.5-2.9), and epilepsy (HR=4.4, 95%CI: 3.2-5.9) were higher in the concussion group. Most comorbidities developed less than five years post-concussion. The risks for post-concussion comorbidities were also higher in patients under 40 years old compared to controls.

Interpretation: Concussion patients demonstrated an increased risk of developing medical and behavioral health comorbidities. Prospective studies are warranted to better describe the burden of long-term comorbidities in concussion patients.

Introduction

Concussion, or mild traumatic brain injury (TBI), is a major public health problem with high rates in contact sports and after falls, particularly in the elderly.¹ Concussions may present with a wide range of signs and symptoms, including sleep disorders, memory impairment, headaches, dizziness, impulsivity, and depression. Additional accumulating evidence indicates that brain injury may trigger progressive degenerative processes affecting brain health and other organ systems.^{2,3} The long-term health outcomes of repetitive mild TBI have gained extensive public attention recently, with epidemiological and pathological studies of military veterans and professional American-style football players reporting chronic multisystem affliction and increased mortality after injury.⁴⁻⁶ In addition to the consequences of repetitive head injury, psychiatric and medical comorbidities have been self-reported by patients after a single moderate or severe TBI.^{7,8} Among those with severe brain injury, chronic comorbidities can increase healthcare costs, complicate the course of recovery, and increase mortality.⁷ Despite the high prevalence of concussion (mild TBI), little is known about long-term medical and behavioral sequelae postinjury.

While the acute neurological effects of concussion often resolve spontaneously over relatively short time periods, long-term effects of concussion on psychiatric, cerebrovascular, and cardiovascular comorbidities are uncertain. Lack of long-term tracking and follow up after TBI could be contributing to this uncertainty.⁹ Studying the timing of the onset of comorbidities, relevant risk factors, and underlying mechanisms are important to identify at risk patients and understand the late life decline and earlier death following mild and severe TBI.^{10,11}

Here we present results from a large observational age-, race-, and sex-matched cohort study up to a 10-year period to (1) assess the risk and time to cardiovascular, psychiatric, endocrine, and cerebrovascular diagnoses in concussed patients compared to non-concussed healthy controls, and (2) evaluate the association between age, and loss of consciousness on development of comorbidities.

Materials and Methods

Study design

In this retrospective cohort study, data were derived from the Mass General Brigham Research Patient Data Registry (RPDR) which captures all inpatient, outpatient and emergency department (ED) diagnoses. The Mass General Brigham Institutional Review Board approved this study.

Patient selection

Patients aged 18 years or older who had at least one inpatient or outpatient visit for concussion between 2000 to 2015 and subsequently at least one inpatient or outpatient follow-up visit between 2000-2019 were included. Controls were identified using RPDR by selecting patients with the same age, sex, and race distribution as the concussion cohort. Controls with history of TBI were excluded. The index date for concussion patients was concussion diagnosis date. For controls, index date was a random hospital or outpatient clinic encounter in the system. Age was calculated at time of first concussion diagnosis or index date for controls. All concussion patients and controls with any comorbidities of interest before the TBI or index date were excluded. The remaining patients and controls were followed for up to 10 years to assess the risk of comorbidities over time.

Exposure

Concussion was identified by International Classification of Diseases, Ninth and Tenth Revision (ICD-9/10) codes according to the Center of Disease Control (CDC) criteria.¹² The cause or injury resulting in the TBI was derived from the ICD-E external cause of injury codes¹³, including falls, motor vehicle accident (MVA), struck by/against, assault and other/unspecified.

Comorbidities

Comorbidities included: psychiatric disorders (depression, anxiety, psychosis, bipolar disorder, sleep disorder, suicide ideation/intent/attempt); substance abuse (drug abuse, opioid abuse, alcoholism); neurological disorders (ischemic stroke, Alzheimer's

disease, vascular dementia), cardiovascular disease (CVD) and risk factors (hypertension, hyperlipidemia, obesity, coronary artery disease); and endocrine disorders (thyroid, pituitary, adrenal, diabetes mellitus); erectile dysfunction; Comorbidity diagnoses were made during subsequent outpatient or inpatient encounters. Comorbidities were identified based on ICD9/10 codes on the first date of diagnosis (**Supplementary Table**).¹⁴ We assessed the risk and determined the time to development of each comorbidities after concussion and index date as the date when each comorbidity first appeared in the medical record. We also evaluated the impact of age and documented loss of consciousness (LOC; as a surrogate for injury severity or vulnerability¹⁵) on the incidence of medical and mental health comorbidities post-concussion.

To ensure concordance between electronic records and physician or specialist diagnosis, a trained abstractor performed manual chart review on a randomly selected 5% of the ICD codes of all comorbidities obtained from electronic medical records (EMR).

Statistical analysis

As appropriate, data were summarized by count and proportion, or median and interquartile range. We used Cox proportional hazards models to examine associations between concussion and diagnosis of mental health or medical conditions in a cohort with uneven follow-up. Concussion patients and controls were censored at the time of comorbidity diagnosis, death, or last encounter in RPDR, whichever came first. We used Schoenfeld residuals to test the proportional hazards assumption. Interaction terms that included a time variable were added when the model did not initially meet the proportional hazards assumption.

To explore encounter bias and to reduce the likelihood that increased medical surveillance accounted for the increased incidence in concussion patients, we excluded those with only a single encounter in the EMR system. Using this restricted dataset, we evaluated associations between all studied comorbidities in concussion patients and controls.¹⁶ To examine bias introduced by differences in the number of encounters before the comorbidity diagnosis in controls versus concussion patients, we also

compared the median number of encounters prior to diagnosis in both the concussion and control groups. We also separately investigated whether concussion patients evaluated in the inpatient-only or outpatient-only setting for their first concussion encounter carried a higher risk for comorbidities that could produce bias.

We examined incident comorbidities in concussion patients compared to controls after stratifying by age and LOC status. Due to loss of effective matching in these analyses, the age-stratified analyses were adjusted for sex and race, and LOC-stratified analyses was adjusted for age, sex, and race. Kaplan-Meier plots were used to describe the cumulative incidence rates of each comorbidity with log-rank test to compare risk difference between concussion and control groups. Differences in associations between concussion and comorbidities by age was examined by assessing multiplicative interaction terms in Cox models. Statistical analyses were performed using R v.3.6.1.¹⁷

Results

We identified a total of 22,855 patients with concussion between 2000 and 2015. Of these, 4,440 patients under 18 years of age and 9,210 patients with histories of prior comorbidities were excluded. The remaining 9,205 concussion patients without a history of comorbidities at the time of concussion (median age=31, interquartile range [IQR]: 23-48 years, 57% male, 72% White) were matched with 9,188 age-, sex-, and race-matched controls (median age=33, IQR: 25-48 years, 57% male, 73% White). The majority (64%) of the patients were in the 18-40-year-old age group. Falls were the most common cause of concussion, accounting for 27% of cases, followed by MVA (21%). Most (83%) concussions were evaluated in outpatient settings and 5% were inpatient. Controls were well-matched to concussion cases on age, sex, and race, but had a smaller number of healthcare visits over the follow-up period (**Table 1**).

Risk of multisystem comorbidities post-concussion

Compared to controls, patients with concussion had significantly higher risk of psychiatric disorders including depression (HR=3.0, 95%CI: 2.6-3.5), anxiety (HR=2.8, 95%CI: 2.5-3.3), and psychosis (HR=6.0, 95%CI: 4.2-8.6; **Table 2**). Risk of sleep disorders (HR=2.8, 95%CI: 2.3-3.4), substance use disorder (HR=3.5, 95%CI: 2.5-4.9), opioid abuse

(HR=3.1, 95%CI: 2.1-4.4), and alcoholism (HR=3.4, 95%CI: 2.6-4.6) were significantly higher following concussion compared to controls within up to 10-years of follow-up period. The incidence of CVD risk factors including hypertension (HR=1.7, 95%CI: 1.5-1.9), hyperlipidemia (HR=1.7, 95%CI: 1.4-1.9), obesity (HR=1.7, 95%CI: 1.3-2.0), and coronary artery disease (HR=1.9, 95%CI: 1.4-2.4) were significantly higher in the concussion group compared to controls. Among endocrine disorders, diabetes mellitus risk was higher in the concussion cohort compared to controls (HR=1.8, 95%CI: 1.4-2.3).

Since there was a significant difference in the total number of encounters between the concussion and control groups (Table 1), we explored the potential effects of encounter bias. We calculated the median number of encounters for concussion and control groups before the diagnosis of each comorbidity. There were no significant differences between the median number of medical encounters prior to diagnosis for all but one comorbidity (thyroid disorders; $p=0.013$). The difference between encounter frequency was almost entirely owing to more frequent visits for the concussion group than controls after comorbidity diagnosis (**Supplementary Table 2**). Sensitivity analyses restricted to all patients with greater than two follow-up visits and to all patients seen in the outpatient setting for their index visit demonstrated the same statistically significant associations between concussion and comorbidities as seen in the full dataset (**Supplementary Tables 3 and 4**). We manually reviewed 5% of the ICD codes to ensure concordance between EMR and physician diagnosis and found that greater than 95% were concordant (data not shown).

Age stratification and risk of multisystem comorbidities post-concussion

We found significantly higher risks for psychiatric disorders such as depression and anxiety post- concussion compared to controls in all age groups ($p<0.001$), except for bipolar disorder, which was not significant in older concussion patients (age >60 years) compared to controls. Risk for psychosis was also significantly higher especially in young (age 18-40, HR=4.1, 95%CI: 2.7-6.2) and middle age concussion patients (age 41-60, HR=15, 95%CI: 5.4-40.4) compared to controls. The notable increase in psychosis for the middle-aged group compared to younger was significant (interaction p -value <0.001; data not shown) but not for older ages. Middle age concussion patients were also at

much higher risk for substance use disorders (age 41-60, HR=8.7, 95%CI: 3.5-21.8) compared to similarly aged controls (**Supplementary Table 5**). The hazard ratio for this group was significantly different than that of younger (interaction p-value=0.009) but not older age groups. However, it is important to note that relatively small numbers in the control groups for these comorbidities may have led to artificially wide confidence intervals. Differences in the effects of concussion on the hazard ratio of many comorbidities by age group were significant for hyperlipidemia, depression, bipolar disorder, schizophrenia/psychosis, anxiety disorder, sleep disorder, suicidality, substance abuse disorder and Alzheimer's disease (interaction p-value range: <0.001 to 0.05; data not shown).

The risk of many common chronic diseases usually associated with aging was increased even in the youngest group (age 18-40) post-concussion. Hypertension (HR=1.3, 95%CI: 1.1-1.8) and obesity (HR=1.6, 95%CI: 1.2-2.1) were significantly associated with concussion in the 18-40 years old age group and in older age groups (**Figure 1a**). We found similar patterns of increased risk of epilepsy (HR=3.8, 95%CI: 2.5-5.9) and substance use disorder (HR=2.9, 95%CI: 2.0-4.2) post-concussion in the younger age group (18-40 years old, **Figure 1 b-c**).

Stratification by loss of consciousness and risk of multisystem comorbidities post-concussion

Forty-one percent of the concussion group had concussion with LOC. Compared to controls, both concussion patients with and without LOC had more post-concussion psychiatric and cardiovascular comorbidities than controls ($p<0.001$). However, concussion patients who experienced LOC had increased risk of psychosis (HR=7.8, 95%CI: 5.3-11.5), suicidal ideation/attempts (HR=5.6, 95%CI: 3.3-9.3) and substance use disorder (HR=4.6, 95%CI: 3.2-6.6) compared to controls. Neurodegenerative diseases such as Alzheimer's disease (HR=2.7, 95%CI: 1.1-6.8) and vascular dementia (HR=4.1, 95%CI: 1.2-14.0) were also more common post-LOC compared to controls (**Table 3**).

Time to development of comorbidities following concussion

Comorbidities across all systems developed within a median time of five years following concussion (**Supplementary Table 6**). Cumulative incidence risk for psychiatric, sleep and substance use disorders, post traumatic epilepsy, and stroke were significant post-concussion compared to controls ($p < 0.005$ for all comparisons, Figure 2c-e), but not for Alzheimer's disease or vascular dementia (**Supplementary Figure 1**). Cumulative incidence risk for all studied CVD risk factors including hypertension, hyperlipidemia, obesity, and coronary artery disease showed significant differences compared to controls ($p < 0.01$ for all comparisons; Figure 2a-b). Similarly, trend for diabetes ($p = 0.0013$) was significant, but not for adrenal, thyroid and pituitary diseases or for erectile dysfunction, compared to controls.

Discussion

To our knowledge, this is the first large study to examine the association between concussion and risk of chronic medical and behavioral health conditions with up to 10-years of follow-up. Compared to controls, patients experiencing concussion without pre-existing comorbidities were at increased risk of developing numerous chronic conditions including CVD, endocrine diseases, and neurological and mental health comorbidities. Higher post-concussion risks were not confined to older ages and were observed among patients as young as 18-40 years old. Most of the comorbidities developed within a median of less than five years following concussion.

Emotional disturbances, sleep, and behavioral problems are common after concussion and are typically transient, but in some cases, may last for months to years.¹⁸ Similarly, we found a significant increase in reported sleep disorders and neuropsychiatric comorbidities such as anxiety and depression in all age groups after concussion.¹⁹

Significantly different hazard ratios found between different age groups for a number of comorbidities may be an effect of aging or may be due to underlying differences in the population strata because recruitment required having no comorbidity diagnoses at baseline. Risk of psychosis post-concussion was significantly higher in middle aged (15-fold) and older patients (9-fold) and remained high even in patients younger than 40 (4-

fold) compared to controls, although the number of events was relatively low. Previous studies suggested a possible link between moderate and severe TBI and delayed onset psychosis,²⁰ but a similar association with mild TBI has not yet been reported. The impact of other factors known to increase the risk for psychosis and other neuropsychiatric comorbidities such as premorbid biological risk, family history and history of prior neurodevelopmental conditions still require further investigation. Few studies have focused on LOC in civilian populations showed that LOC at the time of injury is predictive for depression and post-concussion symptoms in the few months post-TBI^{21,22}. In our study we observed a higher incidence of psychosis, suicidality and substance use disorder among patients who experienced LOC compared to controls. The overall high incidence of neuropsychiatric disorders may play a role in patients' decision making and potentially increase the risk of suicide attempts, and chronic substance use disorder, and even chronic comorbidities in some patients.^{18,23,24} The directionality of these behavioral patterns is still not clear.

Compared to controls, we found a significant increase in CVD and CVD risk factors including hypertension, sleep disorders and obesity after concussion even in the younger age group (18-40-year-old). Concussion patients are at risk for weight gain, sleep disturbances, chronic fatigue and reduction in functional health post-injury which could all play a role in increasing CVD and its risk factors.²⁵⁻²⁸ Overall, it is still not clear whether the heightened CVD risk post-concussion is due to mechanistic causes, other medical comorbidities, subsequent lifestyle changes that put patients at higher risk, or other factors.

We did not find a noticeably high risk of Alzheimer's disease and other types of cognitive impairment in our cohort, even in the older age group (>60 year-old), possibly because our concussion patients had a healthy baseline prior to concussion, having excluded patients with pre-existing medical and mental health comorbidities that may increase risk of Alzheimer's disease. We found an increased risk of stroke subsequent to concussion comparable to that reported in recently published studies.²⁹ The exact mechanisms are not well studied, but this finding could be related to underlying worsening medical comorbidities post injury,^{20,21} as well as reported post-concussion

mechanisms such as neuroinflammation, vascular dysfunction, and increased risk of thrombosis could also contribute.³⁰

Our study has several limitations. First, this is a registry database study from a single academic health system providing primary and tertiary care using structured data captured in the EMR using ICD 9/10 codes. The diagnoses relied on the accuracy and completeness of ICD diagnosis codes which may have led to some misclassification. However, the manual review of hospital records showed a high degree of concordance with the ICD coding. Second, we were not able to identify and exclude patients with prior exposure to sport or repetitive head injuries, nor could we identify concussion patients who did not seek medical attention or whose medical data were stored at other facilities. This weakness is counterbalanced by the large number of patients and long follow-up timeline of the study. Third, we were unable to distinguish between the effect of single and repetitive head injuries on the risks of comorbidities given the limitations of ICD 9/10 codes and EMR structure. In addition, it is uncertain whether findings are generalizable to other cohorts including sport and military personnel. Fourth, we did not quantify concussion severity or general trauma burden, opting instead to explore LOC as a severity index in sensitivity analyses. Fifth, there may be underlying differences that place some people at higher risk for concussion as well as at higher risk for some of the neuropsychiatric conditions studied here, which could confound data analysis and introduce bias to risk estimates. Sixth, results could also be influenced by possible ascertainment bias given less frequent follow-up visits for controls compared to concussion patients. In this setting, simulations have shown that simple adjustments for frequency of visits can also introduce bias.¹⁶ We calculated the median number of encounters for concussion and control groups before the comorbidity diagnosis. While we found no significant differences between the median number of medical encounters prior to diagnosis for all but one comorbidity, there may be unmeasured encounter bias contributing to results. Seventh, we did not adjust for multiple comparisons despite the inclusion of many comorbidities because this was an exploratory study, and we did not want statistical penalties to inhibit discovery.

Conclusion

In summary, although many post-concussive symptoms may resolve without treatment, concussion may have substantial, long-term consequences at any age. We have identified associations between concussion and the risk of chronic behavioral health and medical comorbidities, largely within five years following a documented concussion. Even young adults who sustain concussions are at relatively high risk for comorbid events compared to controls. Future prospective health and mechanistic studies that account for all of the above limitations are warranted. Such studies are needed to understand the biopsychosocial links and investigate the causality or directionality of these comorbidities and assess the role of medical surveillance and preventive protocols.

Authors' contributions

S. Izzy, Z. Tahir, R. Grashow, D. Cote, D. Nathan, K. Miller, A. Baggish, M. Weisskopf, and R. Zafonte contributed to study concept and design.

S. Izzy, Z. Tahir, R. Grashow, D. Cote, A. Al Jarrah, M. Weisskopf contributed to data acquisition and analysis.

S. Izzy, Z. Tahir, R. Grashow, D. Cote, A. Al Jarrah, A. Dhand, H. Taylor, M. Whalen, D. Nathan, K. Miller, F. Speizer, A. Baggish, M. Weisskopf, and R. Zafonte contributed to interpretation of data, drafting and reviewing the manuscript. All authors provided final approval for publication.

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Table 1: Baseline characteristics of concussion patients and age, sex, and race-matched controls.

	Control cohort	Concussion cohort
Total	9,188	9,205
Female	3983 (43%)	3983 (43%)
Male	5205 (57%)	5222 (57%)
Median age	33 (25-48)	31 (23-48)
Age groups		
18-40 years	5867 (64%)	5884 (64%)
41-60 years	2313(25%)	2313(25%)
61-80 years	761 (8%)	761 (8%)
>80 years	247 (3%)	247 (3%)
Race		
White	6718 (73%)	6608 (72%)
Black	728 (8%)	741 (8%)
Hispanic	708 (8%)	668 (7%)
Other	392 (4%)	685 (7.4%)
Missing	642 (7%)	503 (5.6%)
Mechanism of Injury		
Fall	NA	2471 (27%)
MVA	NA	1887 (20.5%)
Struck by/ against	NA	709 (8%)
Assault	NA	571 (8%)
Other	NA	3567 (39%)
First encounter setting		
Inpatient	718 (8%)	492 (5%)

Outpatient	7384 (80%)	7673 (83%)
Outpatient-emergency	171 (2%)	325 (3.5%)
Missing	915 (10%)	715 (8%)
Median (IQR) no. of encounters during follow-up		
Age groups		
18-40 years	2 (1-7)	5 (2-16)
41-60 years	3 (1-11)	8 (2-28)
61-80 years	3 (1-10)	10 (3-27)
>80 years	3 (1-8)	6 (2-18)

Table 2: Hazard ratios for multisystem comorbidities post-concussion compared to control, matched on age, race, and sex.

	Control		Concussion		
Comorbidities	Incidence	Total follow up time (years)	Incidence	Total follow up time (years)	HR (95% CI)
Total (N)	9188		9205		
Cardiovascular					
Hypertension	325	28724	685	43500	1.7 (1.5-1.9) ***
Hyperlipidemia	257	28823	544	44029	1.7 (1.4-1.9) ***
Obesity	145	29216	352	44928	1.7 (1.3-2.0) ***
Coronary artery disease	84	29488	187	45654	1.9 (1.4-2.4) ***
Endocrine					
Thyroid dysfunction	116	29453	237	45808	1.6 (1.2-

					1.9) ***
Pituitary dysfunction	12	29740	20	46360	1.2 (0.5- 2.5)
Diabetes mellitus	98	29440	229	45413	1.8 (1.4- 2.3) ***
Adrenal dysfunction	16	29701	33	46278	1.4 (0.8- 2.8)
Erectile dysfunction	43	15581	73	24821	1.3 (0.9- 1.9)
Psychiatric					
Depression	217	29025	899	42628	3.0 (2.6- 3.5) ***
Bipolar disorder	25	29706	102	46021	2.8 (1.7- 4.4) ***
Schizophrenia/ psychosis	41	29585	309	44821	6.0 (4.2- 8.6) ***
Anxiety disorder	305	28752	1188	41387	2.8 (2.5-

					3.3) ***
Sleep disorder	133	29328	501	44331	2.8 (2.3- 3.4) ***
Suicide ideation/intent/attempt	27	29709	149	45811	4.3 (2.7- 7.0) ***
Substance abuse	52	29634	261	45126	3.5 (2.5- 4.9) ***
Opioid abuse	40	29633	191	45619	3.1 (2.1- 4.4) ***
Alcoholism	71	29562	340	44883	3.4 (2.6- 4.6) ***
Neurological					
Stroke/TIA	58	29619	145	45841	2.1 (1.5- 2.9) ***
Alzheimer's	10	29745	20	46352	1.9 (0.9- 4.4)

Vascular dementia	5	29755	12	46371	2.8 (0.9- 8.7)
Epilepsy/seizures	50	29605	284	45150	4.4 (3.2- 5.9) ***
Significance denoted by * < 0.05, ** < 0.01, *** < 0.001					
Reference= Control group					

Table 3: Stratification by loss of consciousness (LOC) and risk of medical and mental health comorbidities post-concussion, adjusted for age, sex, and race.

Comorbidities	Control (N=9188)	Time to follow up (years)	Concussion without LOC (N=5464)	Time to follow up (years)	Hazard Ratio (95% CI)	Concussion with LOC (N=3741)	Time to follow up (years)	Hazard Ratio (95% CI)
Cardiovascular								
Hypertension	325	28724	390	26708	1.6 (1.4 - 1.9) *	295	16792	1.8 (1.5 - 2.1) *
Hyperlipidemia	257	28823	334	26946	1.7 (1.4 - 2.0) *	210	17082	1.5 (1.3 - 1.9) *

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					*			*
					*			*
					*			*
Obesity	145	29 21 6	222	27 45 6	1. 6 (1 .3 - 2. 1) * * *	130	17 47 2	1. 6 (1 .3 - 2. 1) * * *
Coronary artery disease	84	29 48 8	101	27 97 2	1. 7 (1 .3 - 2. 4) * * *	86	17 68 2	1. 9 (1 .5 - 2. 7) * * *
Endocrine								
Thyroid dysfunction	116	29 45 3	182	27 90 2	1. 9 (1 .5 -	55	17 90 6	0. 9 (0 .7 -

26

					2. 4) * * *			1. 4)
Pituitary dysfunction	12	29 74 0	16	28 31 3	1. 5 (0 .7 - 3. 4)	4	18 04 7	0. 5 (0 .1 - 2. 0)
Diabetes mellitus	98	29 44 0	123	27 82 0	1. 5 (1 .1 - 1. 9) * *	106	17 59 2	2. 2 (1 .6 - 2. 9) * * *
Adrenal dysfunction	16	29 70 1	19	28 29 4	1. 4 (0 .8 - 2. 9)	14	17 98 3	1. 6 (0 .7 - 3. 6)

Erectile dysfunction	43	15 58 1	39	13 35 6	1. 3 (0 .8 - 2. 1)	34	11 46 5	1. 2 (0 .8 - 1. 9)
Psychiatric								
Depression	217	29 02 5	581	25 90 5	3. 0 (2 .6 - 3. 5) * * *	318	16 72 2	2. 9 (2 .4 - 3. 5) * * *
Bipolar disorder	25	29 70 6	58	28 13 1	2. 3 (1 .4 - 3. 8) * *	44	17 88 9	3. 5 (2 .1 - 5. 9) * * *

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Schizophrenia / psychosis	41	29 58 5	160	27 55 0	5. 1 (3 .5 - 7. 4) * * *	149	17 27 1	7. 8 (5 .3 - 1 1. 5) * * *
Anxiety disorder	305	28 75 2	809	25 01 9	2. 8 (2 .5 - 3. 3) * * *	379	16 36 8	2. 5 (2 .1 - 2. 9) * * *
Sleep disorder	133	29 32 8	342	26 94 1	2. 9 (2 .4 - 3. 7) * *	159	17 38 9	2. 4 (1 .9 - 3. 1) * *

					*			*
Suicide ideation/intent/attempt	27	29 70 9	78	28 04 8	3. 4 (2 .0 - 5. 7) * * *	71	17 76 2	5. 6 (3 .3 - 9. 3) * * *
Substance abuse	52	29 63 4	131	27 73 0	2. 9 (2 .0 - 4. 1) * * *	130	17 39 5	4. 6 (3 .2 - 6. 6) * * *
Opioid abuse	40	29 63 3	95	27 99 5	2. 7 (1 .8 - 3. 9) *	96	17 62 4	3. 9 (2 .6 - 5. 7) *

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					*			*
					*			*
Alcoholism	71	29	179	27	2.	161	17	4.
		56		56	9		32	1
		2		1	(2		2	(3
					.1			.0
					-			-
					3.			5.
					9)			6)
					*			*
					*			*
					*			*
Neurological								
Stroke/TIA	58	29	64	28	1.	81	17	2.
		61		12	7		71	8
		9		2	(1		8	(1
					.2			.9
					-			-
					2.			3.
					5)			9)
					*			*
					*			*
					*			*
Alzheimer's	10	29	9	28	1.	11	18	2.
		74		34	5		00	7
		5		2	(0		9	(1
					.6			.1
					-			-
					3.			6.

					9)			8)
								*
Vascular dementia	5	29 75 5	4	28 34 5	1. 8 (0 .4 - 7. 4)	8	18 02 6	4. 1 (1 .2 - 1 4. 0) *
Epilepsy/ seizures	50	29 60 5	164	27 61 6	4. 4 (3 .2 - 6. 2) * * *	120	17 53 3	4. 6 (3 .3 - 6. 5) * * *
Significance denoted by * < 0.05, ** < 0.01, *** < 0.001								
Reference= Control group								

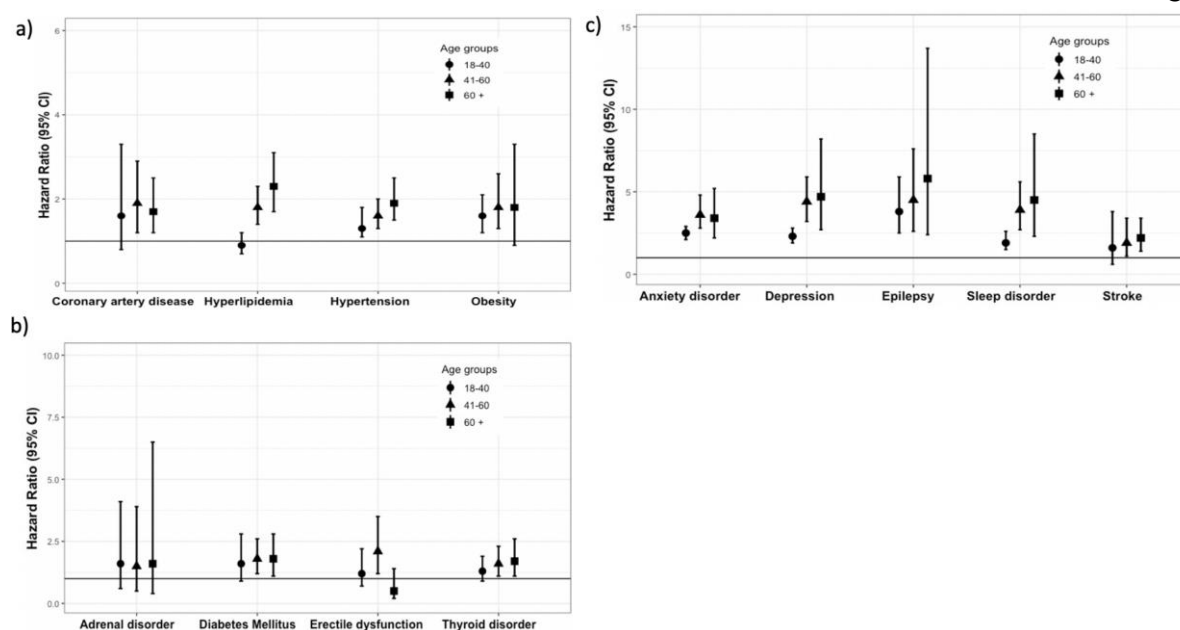


Figure 1: Risk trends of multisystem comorbidities following concussion by age.

Figure shows a) cardiovascular b) endocrine c) psychiatric and neurological risks in three age groups (18-40, 41-60 and >60-year-old) post-concussion.

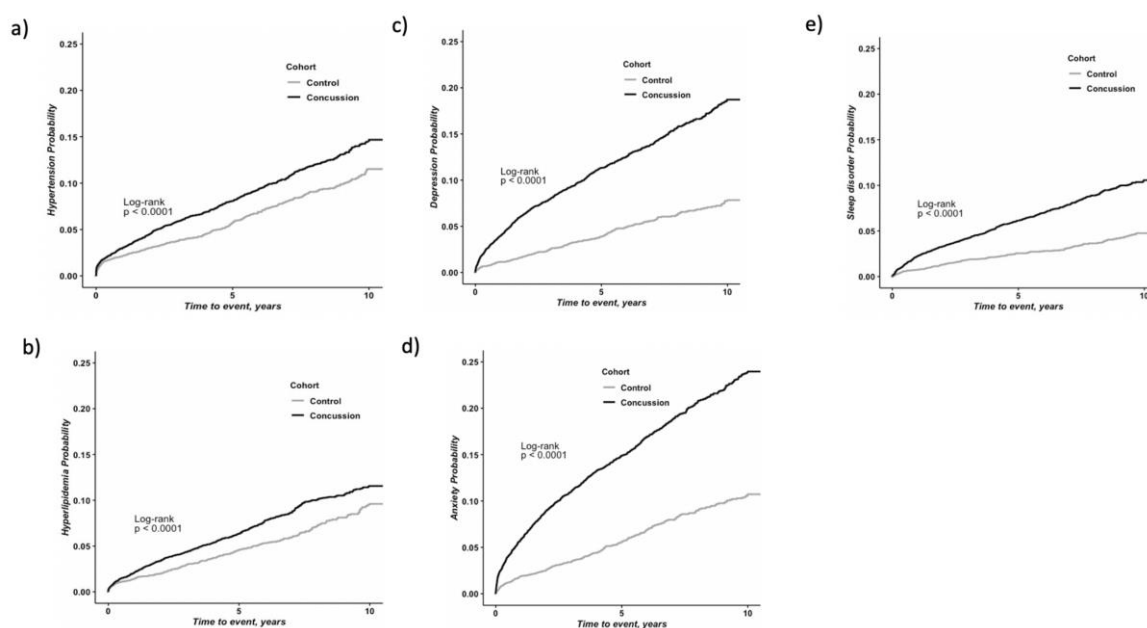


Figure 2: Kaplan-Meier graphs for risk of multisystem comorbidities post-concussion.

Kaplan-Meier graphs showing the cumulative incidence rate of multisystem comorbidities post-concussion including a) hypertension, b) hyperlipidemia, c) depression, d) anxiety, and e) sleep disorders.