Novel and known morbidities of leukodystrophies identified using a phenome-wide association study

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Neurology: Clinical Practice October 2020 vol. 10 no. 5 406-414 doi:10.1212/CPJ.000000000000783

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Abstract

Objective

To determine shared comorbidities and to identify underrecognized or unexpected morbidities in children with leukodystrophies using an unbiased phenome-wide association study (PheWAS) analysis of a nationwide pediatric clinical and financial database.

Methods

Data were extracted from the Pediatric Health Information System database. Patients with leukodystrophy were identified with International Classification of Diseases, 10th revision, clinical modification, diagnostic codes for any of 4 specific leukodystrophies

(X-linked adrenoleukodystrophy (E71.52x), Hurler disease (E76.01), Krabbe disease (E75.23), and metachromatic leukodystrophy (E75.25)) over a 3-year time period. Confirmed leukodystrophy cases (n = 553) were matched with 1659 controls. A PheWAS analysis was performed on all available ICD diagnostic codes for cases and controls. Comparisons were performed for all 4 leukodystrophies as a group and individually.

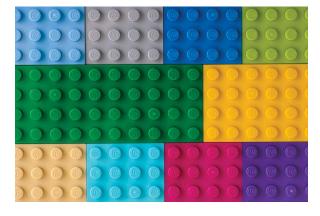
Results

We found 174 phecodes (grouped ICD codes) associated with leukodystrophies, including 28 codes with a rate difference (RD) > 20%. Known comorbidities of leukodystrophies including developmental delay, epilepsy, and adrenal insufficiency were identified. Unexpected associations identified included hypertension (RD 30%, OR 25), hearing loss (RD 28%, OR 15), and cardiac dysrhythmias (RD 27%, OR 9). Hurler disease had a greater number of unique disease conditions.

Conclusions

PheWAS analysis from a national database demonstrates shared and unique features of leukodystrophies. Developmental delay, cardiac dysrhythmias, fluid and electrolyte disturbances, and respiratory issues were common to all 4 leukodystrophy diseases. Use of a PheWAS in leukodystrophies and other pediatric neurologic diseases offers a method for targeting improved care for patients by identification of morbidities.

Leukodystrophies are genetic diseases of the myelin that affect more than 1 in 7,500 live births with a 30% mortality by the age of 8 years. ¹⁻⁴ Leukodystrophies have a broad range of severe morbidities with extensive health care requirements, ^{2,5,6} but sparse data have hampered treatment ^{7–9} and limited clinical trial development.



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Division of Pediatric Neurology (JLB), Department of Pediatrics, University of Utah School of Medicine; Brain and Spine Center (JLB), Primary Children's Hospital, Intermountain Healthcare, Salt Lake City; Intermountain Healthcare (JW), Salt Lake City; Department of Internal Medicine (JY), University of Utah School of Medicine, Salt Lake City; and Department of Biomedical Informatics (W-QW), Vanderbilt University Medical Center, Nashville, TN.

Funding information and disclosures are provided at the end of the article. Full disclosure form information provided by the authors is available with the full text of this article at

The relative rarity of individual leukodystrophies, and absence of a central data registry, has limited understanding of leukodystrophy morbidities.

The relative rarity of individual leukodystrophies, and the absence of a central data registry, has limited understanding of leukodystrophy morbidities. It is not known whether most leukodystrophies share common disease features, whether there are shared patterns of medical complications, and whether shared disease pathophysiology could be targeted for treatment.

Recently, approaches using national electronic health records (EHRs) have been used to identify health care burden in leukodystrophies.⁶ Furthermore, with the advent of diseasespecific codes for individual leukodystrophies in the International Classification of Diseases, 10th edition, clinical modification (ICD-10-CM), more granularity in diagnosis has also become feasible. A novel method for understanding disease-associated morbidities has been the development of an algorithm to determine the association of all disease "phenotypes" with a specified genotype or diagnosis. 10,11 Using this method, a phenome-wide association study (PheWAS) can test for all ICD-9-CM and ICD-10-CM codes associated with a specific diagnosis (such as leukodystrophy) in the EHR. An EHR-based PheWAS has been shown to identify known associations across various disease domains and has the ability to reveal novel associations. 12,13

Our objective was to determine the health conditions associated with hospitalization in patients with leukodystrophy and to identify shared and unique patterns of medical morbidities.

Methods

We conducted a retrospective case-control matched study of patients admitted to a Pediatric Health Information System (PHIS) hospital with an International Classification of Diseases, 10th Revision, clinical modification (ICD-10-CM) diagnosis of one of the following leukodystrophies: metachromatic leukodystrophy (MLD) (E75.25), X-linked adrenoleukodystrophy (ALD) (E71.52x), Krabbe disease (E75.23), and Hurler disease (E76.01). Patient identification was between October 1, 2015, through March 31, 2018.

The PHIS database contains information from 52 children's hospitals in the United States. ¹⁴ Hospitals are affiliated with

the Children's Hospital Association (Lenexa, KS). Although deidentified, the PHIS retains a patient-specific identifier, permitting tracking of patient medical care and use. Data collected includes patient and visit demographics such as age, sex, race, insurance type, type of visit, estimated total visit cost, length of stay, ICD coding, and detailed charge information. The hospital visits included primarily inpatient admissions with additional visit types such as emergency department, observation, ambulatory surgery, and clinic and other visit types where available.

Patients with leukodystrophy were identified from any PHIS visit (inpatient, observation, emergency department, ambulatory surgery, and clinic visit) as having an ICD-10-CM code for one of the 4 leukodystrophies. Each patient with leukodystrophy was matched to 3 control patients. The control patients were identified from the PHIS during the same time period and did not have a leukodystrophy ICD-10-CM code. Matching was performed using patient demographics available at the first PHIS visit, using propensity score matching. The demographic variables used for matching were hospital, sex, race and ethnicity grouping, payer grouping, and patient zip code information (urban/ rural, median 2010 household income). For transplanted patients with leukodystrophy, their controls consisted of patients receiving a hematopoietic stem cell transplant who did not have a leukodystrophy.

Data collected on the cases and controls included demographics at the first available PHIS visit in the collection time frame (quarter 4 of 2015 and onward) and a summary of all available PHIS visits (including visits before the patient identification time window and clinic and other visit types). ICD diagnostic codes available both before and during the patient identification window (both ICD-9-CM and ICD-10-CM) and at all PHIS visit types were also collected.

PheWAS was performed using the PheWAS R package (github.com/PheWAS/PheWAS/tree/v1.0). The ICD codes were crosswalked to phecodes using both an ICD-9-CM and ICD-10-CM crosswalk provided through the PheWAS catalog and the team at Vanderbilt University Medical Center. We truncated all available phecodes to 3–4 digits before a decimal for evaluation. We used the Fisher

Our objective was to determine the health conditions associated with hospitalization in leukodystrophy patients and to identify shared patterns of medical morbidities.

exact test to compare the number of patients in the case vs control groups with at least one instance of each truncated phecode. The phecodes were evaluated between cases and controls for the following 6 groups: overall patients with leukodystrophy, patients with leukodystrophy excluding any patients with a transplant, Hurler, ALD, MLD, and Krabbe. These results are represented using Manhattan plots showing the $-\log 10(p\text{-value})$ and the rate difference (RD) (control rate subtracted from case rate).

Statistical analysis

Analyses were performed with SAS 9.4 (SAS Institute, Cary, NC) using the LOGISTIC procedure for propensity score matching and in R 3.3.2 using the PheWAS package. All analyses were two sided, and a Bonferroni adjusted *p* value < 0.05 was considered statistically significant.

Standard protocol approvals, registrations, and patient consents

This project used deidentified data and was not considered human subjects research and was exempted by the Institutional Review Boards at the University of Utah and the Privacy Board of Intermountain Healthcare.

Data availability

All data reported in this study are published with this study.

Results

We identified 553 patients with one of 4 specific leukodystrophies in the PHIS database over the nearly 3-year study time period and 1,659 matched controls (table 1). The 4 leukodystrophies (X-linked ALD, Hurler disease, Krabbe disease, and MLD) were selected because their ICD-10-CM codes are specific to that individual leukodystrophy genetic diagnosis. By contrast, other leukodystrophies coded using different ICD-9-CM or ICD-10-CM codes such as "sphingolipidoses" (E75.3) are nonspecific⁶ and include a large range of genetically discrete disorders, such as vanishing white matter disease, Canavan Disease, etc.

The cohort was composed of 330 men (60%), with a median age of 6 years (average age 7.4 years); the most common racial groups represented were White non-Hispanic, White Hispanic, and Black non-Hispanic (319 (58%), 107 (19%), and 57 (10%) patients, respectively,). The cohort included 126 patients with ALD (23%), 242 cases of Hurler disease (44%), 60 cases of Krabbe disease (11%), and 125 cases of MLD (23%). Hundred eighty patients (33%) had a transplant. Two hundred twentynine patients (41%) had private insurance.

We adopted a PheWAS algorithm¹¹ for use of ICD-9-CM and ICD-10-CM codes and for evaluation of the PHIS EHR data. The PheWAS algorithm categorizes each ICD-10-CM code into one of 1866 PHeWAS "phecodes" (typically similar diseases or traits), which are further categorized into 17

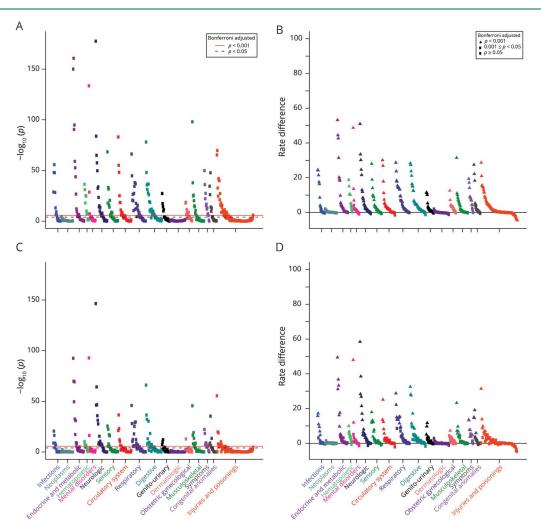
Table 1 Selected demographic characteristics of patients with leukodystrophy and controls in the PHIS used in PheWAS analysis

Leukodystrophy cohort	Controls		
	Value	Value	
Characteristic	n (%)	n (%)	
Sex			
Female	223 (40%)	643 (39%)	
Male	330 (60%)	1016 (61%)	
Race			
White, non-Hispanic	319 (58%)	962 (58%)	
White, Hispanic	107 (19%)	301 (18%)	
Black, non-Hispanic	57 (10%)	189 (11%)	
Other	70 (13%)	207 (12%)	
Insurance			
Government	295 (53%)	885 (55%)	
Private	229 (41%)	704 (42%)	
Other	29 (5%)	70 (4%)	
Age (y), first PHIS presentation			
Average	7.4	7.7	
Median	6	6	
Diagnosis			
ALD	126 (23%)		
Hurler	242 (44%)		
Krabbe	60 (11%)		
MLD	125 (23%)		
 Transplant	180 (33%)	540 (33%)	

Abbreviations: ALD = adrenoleukodystrophy; MLD = metachromatic leukodystrophy; PHIS = Pediatric Health Information System. Total cohort, leukodystrophy, n = 553; controls, n = 1,659.

phenotypic disease category groups, such as "dermatologic" or "neurologic." The proportion of patients with each of the phecodes was compared between patients with leukodystrophy and controls using the Fisher exact test.

In the entire cohort of patients with leukodystrophy, 497 phecodes were identified, of which 174 were associated with leukodystrophy after Bonferroni adjustment (figure 1A; table e-1, links.lww.com/CPJ/A152). We next evaluated the RD between leukodystrophy cases and controls (figure 1B). We observed significant differences across most disease phecode groups. Disease conditions typically associated with leukodystrophies such as "developmental delay," "epilepsy," and infections were observed (table 2; table e-1, links.lww.com/CPJ/A152). However, we also noted



Each panel represents 1,645 phenotypes tested for association using logistic regression assuming a model adjusted for age, sex, insurance type, and location. Phenotypes are grouped along the x-axis by categorization within the PheWAS code hierarchy. The upper red lines indicate p < 0.001 (Bonferroni false discovery rate = 0.1 for the entire PheWAS); lower black lines indicate p < 0.05. (A) Phecodes for the entire leukodystrophy cohort, displayed by p value. (B) Phecodes for the entire leukodystrophy cohort, displayed by p value. (D) Phecodes for the nontransplant leukodystrophy cohort, displayed by rate difference. PheWAS = phenome-wide association study; RD = rate difference.

unexpected associations including hypertension (RD 30%, OR 25), hearing loss (RD 28%, OR 15), and cardiac dysrhythmias (RD 27%, OR 9).

Some diseases detected in the analysis included conditions associated with transplantation, such as graft-vs-host disease. To evaluate whether the pattern and frequency of morbidities identified with PheWAS were primarily linked to transplant or to leukodystrophies, we performed a PheWAS evaluation in which we excluded patients who had received transplantation. We found a very similar pattern of disease group involvement and associations (figure 1, C and D; table e-2, links.lww.com/CPJ/A153; table 3). However, we did find a decrease in the overall number of conditions with a RD of 20% or greater.

To determine whether distinct leukodystrophy diseases had unique morbidities, we performed individual PheWAS

analysis of patients with ALD, Hurler, Krabbe, or MLD (figures 2 and 3; tables e3-e6, links.lww.com/CPJ/A154, links.lww.com/CPJ/A155, links.lww.com/CPJ/A156, links. lww.com/CPJ/A157). We found that all 4 of the leukodystrophies shared many common disease features, including expected features such as developmental delay and lack of normal physiological development. However, unexpected shared features included cardiac dysrhythmias, diseases of the esophagus, and nausea and vomiting. Other features which were commonly but not universally shared included epilepsy, various infection-related diagnoses, and constipation. Finally, some of the disorders had unique disease codes, such as infantile cerebral palsy for MLD or disorders of adrenal glands for ALD. Hurler disease in particular had more disease codes that were distinct from the other 3 leukodystrophies, including hearing loss, heart valve disorders, and abdominal hernia.

Table 2 Conditions with RDs of 30% or more in the entire leukodystrophy cohort (complete results in table e-1, links.lww. com/CPJ/A152)

-	Cases	Cases		Controls	
	N 553	%	N 1659	%	OR
53%	324	59	89	5	24.90
51%	288	52	18	1	98.79
49%	297	54	82	5	22.26
44%	248	45	6	0	223.87
43%	291	53	165	10	10.04
33%	204	37	57	3	16.40
31%	179	32	15	1	52.35
31%	180	33	19	1	41.58
30%	195	35	84	5	10.20
30%	177	32	31	2	24.67
	53% 51% 49% 44% 43% 33% 31% 31% 30%	RD N 553 53% 324 51% 288 49% 297 44% 248 43% 291 33% 204 31% 179 31% 180 30% 195	RD N 553 % 53% 324 59 51% 288 52 49% 297 54 44% 248 45 43% 291 53 33% 204 37 31% 179 32 31% 180 33 30% 195 35	RD N 553 % N 1659 53% 324 59 89 51% 288 52 18 49% 297 54 82 44% 248 45 6 43% 291 53 165 33% 204 37 57 31% 179 32 15 31% 180 33 19 30% 195 35 84	RD N 553 % N 1659 % 53% 324 59 89 5 51% 288 52 18 1 49% 297 54 82 5 44% 248 45 6 0 43% 291 53 165 10 33% 204 37 57 3 31% 179 32 15 1 31% 180 33 19 1 30% 195 35 84 5

Abbreviation: RD = rate difference.

Unexpected associations (e.g. hypertension) are shown in bold. All p values < 0.001.

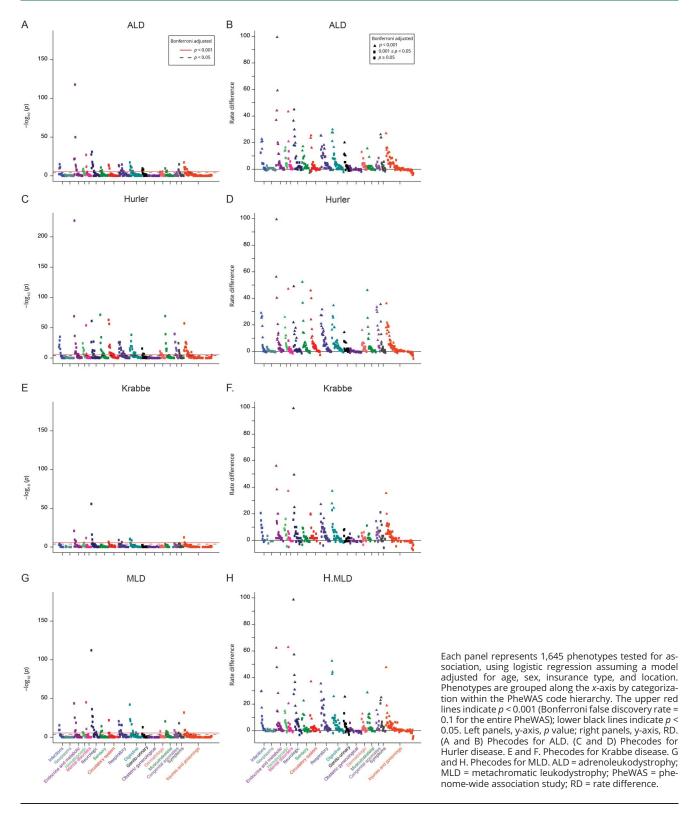
Table 3 Conditions with RDs of 20% or more in the nontransplant leukodystrophy cohort

RD	Cases		Controls		
	N 373	%	N 1119	%	OR
58%	221	59	9	1	177.01
49%	202	54	53	5	23.50
48%	193	52	42	4	27.19
39%	161	43	52	5	15.42
37%	170	46	99	9	8.54
33%	128	34	12	1	47.70
33%	126	34	14	1	39.87
31%	127	34	29	3	19.20
31%	118	32	5	0	101.99
29%	120	32	38	3	13.36
28%	117	31	34	3	14.44
28%	129	35	72	6	7.61
28%	134	36	93	8	6.13
27%	108	29	24	2	18.40
25%	108	29	43	4	10.10
23%	90	24	10	1	34.92
22%	101	27	55	5	7.12
21%	87	23	21	2	15.75
	58% 49% 48% 39% 37% 33% 33% 31% 29% 28% 28% 22%	RD N 373 58% 221 49% 202 48% 193 39% 161 37% 170 33% 128 33% 126 31% 127 31% 118 29% 120 28% 117 28% 129 28% 134 27% 108 25% 108 23% 90 22% 101	RD N 373 % 58% 221 59 49% 202 54 48% 193 52 39% 161 43 37% 170 46 33% 128 34 33% 126 34 31% 127 34 31% 118 32 29% 120 32 28% 117 31 28% 129 35 28% 134 36 27% 108 29 25% 108 29 23% 90 24 22% 101 27	RD N 373 % N 1119 58% 221 59 9 49% 202 54 53 48% 193 52 42 39% 161 43 52 37% 170 46 99 33% 128 34 12 33% 126 34 14 31% 127 34 29 31% 118 32 5 29% 120 32 38 28% 117 31 34 28% 129 35 72 28% 134 36 93 27% 108 29 24 25% 108 29 43 23% 90 24 10 22% 101 27 55	RD N 373 % N 1119 % 58% 221 59 9 1 49% 202 54 53 5 48% 193 52 42 4 39% 161 43 52 5 37% 170 46 99 9 33% 128 34 12 1 33% 126 34 14 1 31% 127 34 29 3 31% 118 32 5 0 29% 120 32 38 3 28% 117 31 34 3 28% 129 35 72 6 28% 134 36 93 8 27% 108 29 24 2 25% 108 29 43 4 23% 90 24 10 1

Abbreviation: RD = rate difference.

Unexpected associations (e.g., constipation) are shown in bold. All $\it p$ values < 0.001.

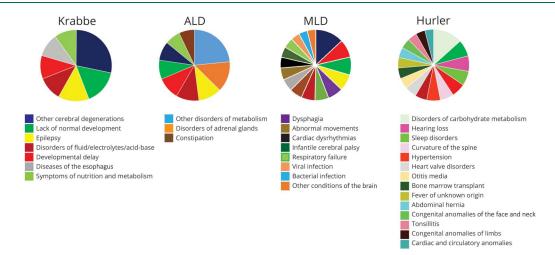
Figure 2 PheWAS plots for individual leukodystrophies



Discussion

We performed a national evaluation of medical morbidities in leukodystrophies. This PheWAS analysis of a national pediatric database demonstrates shared and unique disease features of leukodystrophies. All 4 of the leukodystrophies shared disease features, including expected features such as developmental delay and lack of normal physiological development. However, unexpected features which included cardiac dysrhythmias, diseases of the esophagus, and nausea

Figure 3 Conditions with RDs of 30% or more in the individual leukodystrophies, displayed by leukodystrophy in the order of increasing number of conditions (phecodes)



Values reported in tables e3-e6, links.lww.com/CPJ/A154, links.lww.com/CPJ/A155, links.lww.com/CPJ/A156, links.lww.com/CPJ/A157. All *p* values < 0.001. Phecodes are color-coded for all charts; phecode (and its color in the pie chart) is only listed the first time it is reported. RD = rate difference.

and vomiting were also observed in all 4 leukodystrophies. These features suggest a need to evaluate cardiac rhythm features in patients with leukodystrophy and presumably that gastrointestinal issues, for example, reflux, are a more problematic feature than typically considered. Fluid and electrolyte disturbances, presumably during the course of hospitalization, were also significantly observed in all 4 leukodystrophies.

Other features were commonly but not universally shared including epilepsy, various infection-related diagnoses, and constipation. Infection-related issues are a known morbidity in leukodystrophies and can be amenable to intervention.¹⁵ Finally, some of the leukodystrophies had unique disease associations, such as infantile cerebral palsy for MLD or disorders of adrenal glands for ALD. Hurler disease in particular had more disease codes that were distinct from the other 3 leukodystrophies, including hearing loss, heart valve disorders, and abdominal hernia. This suggests that the more extensive multiorgan involvement in Hurler disease leads to a different pattern of morbidities than the predominant "CNS-only" complications of ALD, Krabbe disease, and MLD. Similarly, the greater number of significant morbidities observed in MLD might reflect that more patients received bone marrow transplantation, as compared to patients with Krabbe or ALD.

Identification of these morbidities could assist with designing patient treatment strategies and with guiding clinical trial design. Although promising treatments and cures for several leukodystrophies appear to be nearing clinical use, ^{16,17} even in the absence of a cure, improvements in patient care can be accomplished by targeting known morbidities. ¹⁸ This could help with the burden of hospitalizations in leukodystrophy:

patients with leukodystrophy in children's hospitals account for \$59 million per year in total costs. Individually, their treatment and care cost is 5 times the average cost for a hospitalized child.⁶

Specific interventions that could be considered based on the findings here could include targeted epilepsy education for families of patients with leukodystrophy, based on the observed morbidity of *epilepsy*; proactive treatment of constipation; and determining the issues regarding nutrition because this was common to all 4 leukodystrophies. Thus, although some of the morbidities are nonspecific to leukodystrophies, the findings offer potential for interventions that might have a meaningful impact on a patient and their family. Furthermore, treatments or care plans could be assessed for their impact on quality of life, in which symptoms such as constipation could be followed to determine whether there is improvement for patients.

Strength of this work is the use of leukodystrophy disease-specific ICD-10-CM codes. This work would not have been feasible previously because ICD-9-CM codes have low specificity to the diagnosis of an inherited leukodystrophy and complex algorithms had to be used with ICD-9-CM codes to track leukodystrophies. With the use of ICD-10-CM codes for ALD, MLD, Krabbe, and Hurler, we were able to track and compare specific leukodystrophies. Finally, the use of the PHIS national database provides a more comprehensive view of trends across the United States for these relatively rare diseases. Coding of PheWAS is relatively specific to the morbidity. For example, "cardiac dysrhythmias" does not indicate that an EKG was performed, but rather that a cardiac rhythm disturbance such as atrial fibrillation was present. 10

Limitations include use of retrospective data and the limited temporal duration of data collection. The time limitation was necessary because the use of ICD-10-CM has only been over the past 3 years, and ICD-10-CM code use was necessary to have sufficient specificity in determining diagnoses. Furthermore, even with the use of national databases, in some instances, there were very few patients experiencing certain morbidities, thus limiting the statistical power of PheWAS. This study was not organized in a fashion to collect data on all patients with leukodystrophy with a diagnosis of ALD, MLD, Krabbe, or Hurler, and we cannot use the data to determine incidences or prevalences. However, one advantage is that it includes data on any patient with a given diagnosis during the enrollment time frame. That is, even if a patient with Krabbe was born in 2013 before the study and if they came to the hospital in 2016, they were still included in our analysis.

This work demonstrates a broad extent of shared morbidities in children with leukodystrophies. With this same methodology, many avenues of investigation are possible. For example, to investigate whether different commonly used medications in different leukodystrophies associate with the presence or absence of comorbidities, which could provide information about improved medicine choice for patients with leukodystrophy. The scope of the work was limited in that only 4 leukodystrophies could be specifically examined, and future efforts should include the adoption of more specific ICD codes for leukodystrophies. It seems countersensical that specific ICD-10-CM codes exist for "sucked into jet engine" and "injury at library," but not to distinguish Canavan disease from vanishing white matter disease, for example. In conclusion, use of PheWAS in leukodystrophies and other pediatric neurologic diseases offers a method for characterizing disease burden and targeting improved care for patients.

Acknowledgment

We appreciate the advice and suggestions of R.J. Carroll, J.C. Denny, M. Hall, and T. Richardson.

Study funding

J.L. Bonkowsky was supported by NIH grant 3UL1TR002538 and by the Bray Presidential Chair in Child Neurology research. This investigation was supported by the University of Utah Study Design and Biostatistics Center, with funding in part from the National Center for Research Resources and the National Center for Advancing Translational Sciences, National Institutes of Health, through Grant 8UL1TR000105 (formerly UL1RR025764).

Disclosure

J.L. Bonkowsky was supported by NIH grant 3UL1TR002538 and by the Bray Presidential Chair in Child Neurology research; has served as a consultant to Bluebird Bio, Inc., Calico, Inc., Neurogene, Inc.; is on the Board of Directors of wFluidx, Inc.; and owns stock in Orchard Therapeutics. J. Wilkes reports no disclosures. J. Ying was supported by the University

TAKE-HOME POINTS

- → We performed a PheWAS analysis of leukodystrophy comorbidities using a national database.
- → Developmental delay, epilepsy, fluid and electrolyte disturbances, and respiratory issues were shared morbidities in leukodystrophies.
- → PheWAS identified unexpected morbidities including hypertension, hearing loss, and cardiac dysrhythmias.
- → Information from PheWAS analysis provides targets for clinical treatments and for following outcomes in patients with leukodystrophy.

of Utah Study Design and Biostatistics Center, with funding in part from the National Center for Research Resources and the National Center for Advancing Translational Sciences, National Institutes of Health, through Grant 8UL1TR000105 (formerly UL1RR025764). W.-Q. Wei was supported by NHLBI R01HL133786. Full disclosure form information provided by the authors is available with the full text of this article at Neurology.org/cp.

Publication history

Received by *Neurology: Clinical Practice* June 11, 2019. Accepted in final form September 23, 2019.

	Ap	pendix	Authors
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Josh L. Bonkowsky, MD, PhD	Division of Pediatric Neurology, Department of Pediatrics, University of Utah School of Medicine; Brain and Spine Center, Primary Children's Hospital, Intermountain Healthcare, Salt Lake City, UT	Designed and conceptualized the study, analyzed the data, and drafted and edited the manuscript for intellectual content.
Jacob Wilkes, BS	Intermountain Healthcare, Salt Lake City, UT	Designed the study, collected and analyzed the data, and edited the manuscript for intellectual content.
Jian Ying, PhD	Department of Internal Medicine, University of Utah School of Medicine, Salt Lake City, UT	Designed the study, analyzed the data, and edited the manuscript for intellectual content.
Wei-Qi Wei, MD, PhD	Department of Biomedical Informatics, Vanderbilt University Medical Center, Nashville, TN	Designed the study and edited the manuscript for intellectual content.

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