# Genetics in Medicine



# **ARTICLE**

# Neurofilament light chain levels correlate with clinical measures in CLN3 disease

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**PURPOSE:** CLN3 disease is a neurodegenerative disorder with onset in childhood. It affects multiple functions at different developmental stages. Incomplete understanding of the pathophysiology hampers identification of cell and tissue biochemical compounds reflective of the disease process. As treatment approaches are being explored, more sensitive, objective, quantifiable, and clinically relevant biomarkers are needed.

**METHODS:** We collected prospective biosamples from 21 phenotyped individuals with CLN3. We measured neurofilament light chain (NEFL) levels, a marker of neuronal damage, in cross-sectional CSF and serum samples from individuals with CLN3 and in pediatric non-CLN3 controls using two different assays.

**RESULTS:** Cerebrospinal fluid (CSF) and serum NEFL levels are significantly higher in CLN3 (CSF:  $2096 \pm 1202$ ; serum:  $29.0 \pm 18.0$  pg/mL) versus similarly aged non-CLN3 (CSF:  $345 \pm 610$ ; serum:  $6.7 \pm 3.2$  pg/mL) samples. NEFL levels correlate with Unified Batten Disease Rating Scale and adaptive behavior composite scores, and magnetic resonance (MR) spectroscopy markers. NEFL levels from CSF and serum are strongly correlated ( $r_p = 0.83$ ; p < 0.0001).

**CONCLUSION:** CSF and serum NEFL levels increase in multiple neurologic conditions. Here, we show that CSF and serum NEFL levels also increase in CLN3 (versus non-CLN3) and correlate with other disease-relevant measures. These findings suggest NEFL as a relevant and feasible biomarker for applications in CLN3 clinical trials and management.

Genetics in Medicine (2021) 23:751-757; https://doi.org/10.1038/s41436-020-01035-3

# INTRODUCTION

Collectively, the neuronal ceroid lipofuscinoses (NCLs) comprise one of the most common groups of diseases with neurodegenerative presentation in the pediatric age range. Of the 13 known NCL types, CLN3 disease (OMIM 204200; juvenile neuronal ceroid lipofuscinosis, Batten disease) is the most common. Since the first description of individuals with the juvenile onset type of NCL by Otto Christian Stengel in 1826, its clinical symptoms and presentation have been extensively characterized. 1,2 CLN3 disease is a pan-ethnic, autosomal recessive, neurodegenerative disease with an estimated incidence ranging from 1:10,000 in Scandinavia to 1:100,000 worldwide.<sup>3</sup> While it is considered a lysosomal disease based on accumulation of autofluorescent storage materials in the organelle, the function of the protein encoded by the CLN3 gene has not been clearly elucidated.<sup>4</sup> The most common pathogenic variant in CLN3 is a 966-bp (commonly known as 1-kb, exons 7-8) deletion found in homozygous or compound heterozygous state in ~95% of individuals with CLN3 disease.5

Frequent symptoms reported in individuals with the typical CLN3 disease course include progressive vision loss leading to blindness, neurocognitive decline, and loss of previously acquired ability leading to dementia, behavioral and psychiatric disturbances, development of seizures and a movement disorder similar to what is seen in Parkinson disease. 1.2.7 The vision loss is reflected in decreased to absent electroretinogram responses, and thinning to loss of distinct retinal cell layers on optical coherence tomography. Neurocognitive plateauing and declines

are demonstrated by decreased performance on neuropsychological tests in areas such as IQ<sup>8</sup> and adaptive behavior. Brain volumetric imaging has also demonstrated generalized volume loss, correlating with disease duration. The Hamburg scale and the Unified Batten Disease Rating Scale (UBDRS) provide clinical ratings of disease severity and progression.

Challenges remain in the application of the above outcome measures in the typical short-term design of interventional trials. CLN3 symptoms present asynchronously over a relatively protracted time frame. A high portion of affected individuals harbor functionally significant vision loss by 6–7 years of age, whereas the Parkinsonian motor abnormalities have typical onset in the midteen years. In addition, clinical assessment measures rely partially on the evaluators' expertise and the affected individuals' cooperation. Longitudinal and quantitative assessments may be limited by disease state, methodologies, and resource availability. Recent work on identifying disease-reflective biochemical markers for CLN3 employed different tissues and analysis methods that yielded variable results. <sup>13–15</sup> Furthermore, the proposed candidate biomarkers need additional work to demonstrate clinical validity.

Neurofilament light (NEFL) chain is an intermediate filament type with an estimated molecular weight of 70–86 kDa. <sup>16</sup> It is a stable component of the neuronal axon and has a low turnover rate. <sup>17–19</sup> Processes leading to neuronal damage ranging from physical in traumatic brain injuries, to inflammation in multiple sclerosis, to abnormal and normal aging cause release of NEFL from injured cells. <sup>16,20–23</sup> Individuals with different forms of

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Table 1. CSF and serum sample characteristics and assayed methods.

Group	n	Age (years)				Sex, n (%)		Assay method		
		Median	Range			Female	Male	CSF		Serum
			Q1	Q3	Full			PEA	ELISA	Simoa <sup>™</sup>
CLN3	21	11.4	7.8	15.4	6.8-20.7	10 (48)	11 (52)	1	✓	✓
Comparators (n)								32	33	34
Pediatric laboratory controls	20	12.5	7.5	15.5	3.0-20.0	10 (50)	10 (50)	✓		
PLC subset	9	14.0	7.0	17.0	4.8-20.0	2 (22)	7 (78)	✓	✓	
Pediatric healthy siblings	10	10.8	9.4	13.3	6.3-18.7	4 (40)	6 (60)			✓
CTD	12	7.0	3.9	10.8	3.2-14.3	0	12	✓	✓	✓
SLOS	12	9.4	5.2	13.7	2.6-21.0	5 (42)	7 (58)		✓	✓

CSF cerebrospinal fluid, CTD creatine transporter deficiency, ELISA enzyme-linked immunosorbent assay, PEA proximal extension assay, PLC pediatric laboratory controls, Q1 quartile 1, 25th percentile, Q3 quartile 3, 75th percentile, Simoa<sup>TM</sup> single molecule array, SLOS Smith-Lemli-Opitz syndrome.

dementia have elevated level of NEFL in the cerebrospinal fluid (CSF) compared with that seen in healthy controls, with non-Alzheimer-like dementia types having higher CSF NEFL levels. <sup>22</sup> Elevated CSF NEFL level is also seen in individuals with other degenerative conditions involving motor neurons such as amyotrophic lateral sclerosis and Parkinson disease. <sup>20,23,24</sup> The small size of NEFL permits its diffusion from CSF into blood, thus the elevated NEFL profile is also detected in plasma and serum samples from individuals with various neurodegenerative diseases. <sup>20,24–27</sup>

To complement clinical outcome measures and provide an objective assessment of disease status and progression, we incorporated biospecimen collection and biochemical marker discovery in a natural history study of individuals with CLN3 (NCT03307304). In this report, we investigated the level of NEFL in CSF and corresponding serum samples at baseline from individuals with CLN3 disease.

We hypothesized that NEFL level would be higher in individuals with CLN3 compared with those without CLN3 (e.g., healthy and unaffected, non-neurodegenerative conditions). We anticipated that NEFL level would correlate with CLN3 clinical outcome measures.

# **MATERIALS AND METHODS**

# Clinical measures and sample collections

We evaluated individuals with CLN3 using the UBDRS subdomains (27-item physical, 5-item capability given actual vision, and 7-item clinical summary [Clinical Global Impression; CGI]). <sup>12,28</sup> A weighted score for each subdomain was calculated as follows: [total score for all completed items / (total possible score of all items – total possible score of missing items)] × total possible score of all items. We also obtained Vineland adaptive behavior composite (ABC) scores; <sup>29</sup> and magnetic resonance (MR) spectroscopy quantification of metabolites (creatine [Cr], glutamine/glutamate/GABA [Glx], and N-acetyl aspartate [NAA]) from a voxel in the midline parietal gray matter (PGM). <sup>30</sup> Available demographics and genotype for all samples, biomarker analyses completed, and a summary of relevant outcome measures for the CLN3 samples are described in Tables 1, S1, and S2.

We collected serum samples in the morning following an overnight fast in tubes with no anticoagulant or preservative. We collected CSF samples on the same morning, typically under sedation, using standard procedures. Collected CSF samples were transported at room temperature and aliquoted for storage at  $-80\,^{\circ}\text{C}$  within 1 hour of collection. If the CSF sample was visually observed to have blood contamination, it was centrifuged at 3400 rpm for 10 minutes and the supernatant aliquoted for storage. We requested pediatric anonymized, leftover, unused CSF samples from outside clinical laboratories for use as unaffected CSF controls (pediatric laboratory controls; NCT00344331). These samples had information on the individuals' sex and age at the time of sampling. We collected

fasting serum samples from unaffected siblings of individuals with CLN3 (pediatric healthy siblings; NCT03307304) to use as unaffected serum controls.

# Neurofilament light chain assays

*Proximal extension assay (PEA).* We randomized the position of samples on a 96-well plate<sup>31</sup> and aliquoted 40 microliters of CSF samples per well. The sample plate was sealed, frozen, and shipped on dry ice to Olink® (Boston, MA) for Neuro Exploratory Panel<sup>32</sup> assay. For analyses, we used the normalized protein expression (NPX) value, a logarithmic relative quantitative value where an increase of 1 NPX represents a doubling of protein expression level.<sup>33</sup>

ELISA. We used a solid-phase sandwich enzyme-linked immunosorbent assay (ELISA) kit (UmanDiagnostics, Umea, Sweden; catalog number: 10-7002 RUO) and followed the manufacturer's instructions to measure CSF NEFL levels. Limit of detection (LOD) was 33 pg/ml. All samples were diluted 1:2 and analyzed blindly and in singlets. Samples were analyzed batch-wise, in two batches (plates). Location of study samples on each plate was randomized.<sup>31</sup> In each batch we analyzed a control sample in duplicate. Coefficient of variation (CV) for control sample across batches was 2.2%, confirming assay precision and reproducibly. For values less than the LOD, 16.5 pg/ml (midpoint between 0 and 33 given 1:2 dilution) was used.

Single molecule array (Simoa<sup>TM</sup>). We used a Simoa<sup>TM</sup> assay kit (Quanterix, Billerica, MA; product number: 103186) and a Simoa<sup>TM</sup> HD-1 analyzer to measure serum NEFL levels. LOD was 0.038 pg/ml. All samples were diluted 1:4 and analyzed blindly and in singlets in a single batch (plate). Location of study samples on each plate was randomized.<sup>31</sup> Quality control samples (QCs) provided with the kit have measured concentrations within given range, confirming assay precision.

# Statistical analyses

Data were described and checked by frequency distributions (percentages) and simple descriptive statistics (mean  $\pm$  SD). Distributional assumptions were assessed, and data were log-transformed as necessary. Where data distributions were uncertain, both parametric and nonparametric tests were carried out; no differences in conclusions were observed. Continuous data between groups were compared using t-tests (and nonparametric Wilcoxon rank-sum tests, if appropriate). Analysis of variance (ANOVA) (and Kruskal–Wallis) tests compared the various subgroups; p values from post hoc subgroup/pairwise tests were corrected for multiplicity (built-in Bonferroni). Correlation analyses used the Pearson correlation coefficient and Fisher's z-transformation for bias correction, and 95% confidence intervals (CIs) were computed and are shown in the figures. P values for the correlation analyses were corrected for multiple comparisons using the stepdown Bonferroni method. Where described (i.e., Fig. 3), both raw and multiple comparison-corrected p values were provided. Data were

analyzed using SAS v9.4 (SAS Institute, Inc, Cary, NC). Graphs were generated using SAS, Microsoft Excel, and PowerPoint.

#### **RESULTS**

#### Sample and data characteristics

Age and sex distributions for the cohorts are similar among the comparison groups (Table 1). While log-transformations of data (i.e., for ELISA) improved distributions, they had minimal impact on the conclusions; thus, results are reported and shown in their original raw scales for easier interpretation. In addition, the data were assessed for factors that could potentially influence results as follows. Of the 21 CLN3 samples, 6 were collected from three affected sibling pairs. Sensitivity analyses excluding the older and the younger of the siblings revealed negligible effects on the correlations and confidence intervals; thus, we elected to keep all 21 samples in all analyses. Calculations made using measured NEFL levels versus those using age-adjusted (for CSF ELISA and serum Simoa<sup>TM</sup> samples) and blood volume-adjusted (for serum samples) levels did not alter any of the conclusions. Multiple regression analyses on the correlations of interest adjusting for age generally showed small percentages (<10%) of the variability in the outcomes accounted by age. There were a few exceptions; however, none of the conclusions from the models with or without age were different. Thus, we decided to use measured CSF and serum NEFL levels in further analyses.

NEFL levels in individuals with CLN3 disease are elevated in CSF and serum

NEFL levels in CSF samples measured by PEA and ELISA. While both PEA and ELISA measure expressed NEFL level, each has a unique advantage. PEA incorporates quantitative reverse transcription polymerase chain reaction (qRT-PCR) for signal amplification, thus expanding the sensitivity range and reducing the amount of sample input required. This is relevant for a screening assay. ELISA assay provides the ability for absolute quantitation of NEFL level, a function currently unavailable with the PEA method. Absolute quantification allows results to be compared across time and from different cohorts. The purpose of using both methods was to explore their utility, not to compare directly the results.

Values from PEA and ELISA assays were strongly correlated  $(r_p = 0.69; p < 0.0001)$  (Fig. S1). CSF NEFL normalized protein expression (NPX) value by PEA was higher in the CLN3 ( $9.3 \pm 1.0$ ) compared with that in the combined non-CLN3 (7.4  $\pm$  2.7; p =0.0013) samples (Fig. S2a). ANOVA and post hoc subgroup comparisons showed a difference in NEFL levels in the CLN3 versus creatine transporter deficiency (CTD, p = 0.0005), but not in the CLN3 versus pediatric laboratory control (p = 0.32) sample pairings (Fig. S2b). CSF sample from healthy, unaffected pediatric individuals cannot be obtained for research purpose. Pediatric laboratory control samples were collected from individuals with clinical indications for a lumbar puncture. These samples have multiple limitations including limited number and volume, incomplete clinical information, different collection and handling and likely include individuals with neurological processes affecting NEFL level. These limitations became apparent when using PEA, and thus for the ELISA we included as comparison pediatric samples from two non-neurodegenerative disorders (CTD and SLOS) that were collected under similar conditions.

CSF NEFL measured by ELISA was much higher  $(2096 \pm 1202 \text{ pg/mL})$  in the CLN3 compared with  $345 \pm 610 \text{ pg/mL}$  in the non-CLN3 cohort (p < 0.0001) (Fig. S3). Post hoc subgroup comparisons showed that the difference was driven by CLN3 versus each of pediatric laboratory control (PLC, p = 0.0017), CTD (p < 0.0001), and Smith-Lemli-Opitz syndrome (SLOS, p < 0.0001) sample pairings (Fig. 1).

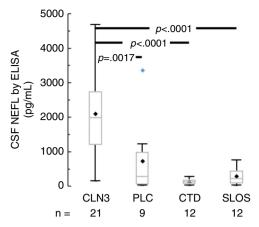


Fig. 1 CSF NEFL level in samples from CLN3 versus non-CLN3 (PLC, CTD, SLOS) individuals, measured by enzyme-linked immunosorbent assay (ELISA). Black diamond—mean; blue diamond—outlier; box—median and interquartile range (IQR, Q1 [25th percentile]–Q3 [75th percentile]); whiskers—minimum = Q1 – 1.5\*IQR and maximum = Q3 + 1.5\*IQR. *P* values are derived from analysis of variance (ANOVA) and post hoc Bonferroni adjustment for pairwise multiple comparisons. *CSF* cerebrospinal fluid, *CTD* creatine transport deficiency, *ELISA* enzyme-linked immunosorbent assay, *NEFL* neurofilament light chain, *PLC* pediatric laboratory controls, *SLOS* Smith–Lemli–Opitz syndrome.

NEFL levels in serum samples measured by single molecule array (Simoa<sup>TM</sup>). Blood samples are relatively more easily obtained and more practical for multicenter therapeutic trials. Thus, we explored NEFL level in CLN3 versus non-CLN3 (pediatric healthy sibling [PHS], CTD, SLOS) serum samples, and the correlation between paired CSF and serum samples. Mean serum NEFL level was higher in CLN3 (29.0  $\pm$  18.0 pg/mL) than non-CLN3 (6.7  $\pm$  3.2 pg/mL; p < 0.0001) samples (Fig. S4). ANOVA and subgroup comparisons showed that the difference was reflected in CLN3 versus each of PHS (p < 0.0001), CTD (p < 0.0001), and SLOS (p < 0.0001) sample pairings (Fig. 2). NEFL level in corresponding CSF and serum samples correlated positively between PEA ( $r_p$  = 0.75; p < 0.0001) or ELISA ( $r_p$  = 0.83; p < 0.0001) versus Simoa<sup>TM</sup> measurements (Fig. S5).

NEFL levels correlate with clinical outcome measures

NEFL levels positively correlated with age in CSF by ELISA ( $r_p = 0.62, 95\%$  CI = [0.25, 0.83],  $p_{\rm adj} = 0.02$ ) and PEA ( $r_p = 0.47, [0.05, 0.75], p_{\rm adj} = 0.11$ ), although the latter value had a larger CI and adjusted p value (Fig. S6). Serum NEFL level did not correlate with age ( $r_p = 0.28, [-0.18, 0.63], p_{\rm adj} = 0.66$ ). We tested correlations between CSF or serum NEFL levels and other clinical outcome measures (UBDRS and Vineland ABC scores, and MR spectroscopy measurements) in CLN3 study participants (Figs. 3, S6, S7). Higher UBDRS physical and CGI scores indicate more severe,  $^{12,28,34}$  whereas higher capability with actual vision  $^{12,34}$  and Vineland ABC scores (manuscript submitted) indicate less severe disease. Higher levels of N-acetyl aspartate (NAA), glutamatergic (Glx), and creatine (Cr) on spectroscopy indicate the presence of healthy neurons.  $^{30}$ 

NEFL levels in both CSF and serum were positively correlated with UBDRS physical (CSF by ELISA:  $r_p = 0.66$ , [0.32, 0.85],  $p_{\rm adj} = 0.006$ ; serum by Simoa<sup>TM</sup>:  $r_p = 0.65$ , [0.30, 0.84],  $p_{\rm adj} = 0.01$ ), and inversely correlated with UBDRS capability (CSF by ELISA:  $r_p = -0.62$ , [-0.83, -0.25],  $p_{\rm adj} = 0.01$ ; serum by Simoa<sup>TM</sup>:  $r_p = -0.60$ , [-0.82, -0.23],  $p_{\rm adj} = 0.02$ ) scores. CSF NEFL level measured by both PEA and ELISA also showed positive correlations with UBDRS CGI (PEA:  $r_p = 0.74$ , [0.45, 0.89],  $p_{\rm adj} = .001$ ; ELISA:  $r_p = 0.64$ , [0.29, 0.84],  $p_{\rm adj} = 0.001$ ), and inverse correlations with Vineland ABC

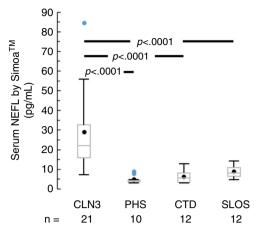
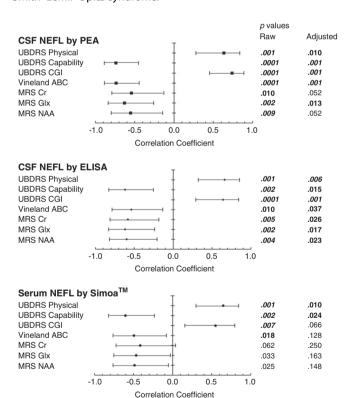


Fig. 2 Serum NEFL level in samples from CLN3 versus non-CLN3 (PHS, CTD, SLOS) individuals, measured by Simoa<sup>TM</sup>. Black circle—mean; blue circle—outlier; box—median and interquartile range (IQR, Q1 [25th percentile] – Q3 [75th percentile]); whiskers—minimum = Q1 – 1.5\*IQR and maximum = Q3 + 1.5\*IQR. *P* values are derived from analysis of variance (ANOVA) and post hoc Bonferroni adjustment for multiple pairwise comparisons. *CSF* cerebrospinal fluid, *CTD* creatine transport deficiency, *NEFL* neurofilament light chain, *PHS* pediatric healthy (unaffected) siblings, *SLOS* Smith–Lemli–Opitz syndrome.



**Fig. 3** Correlation of NEFL levels with clinical outcome measures, by assay method. Forest plot indicates the correlation coefficients along with 95% confidence limits. The horizontal axes describe the magnitude of the correlation coefficients, with <0 suggesting inverse relations and >0 suggesting positive relations. Adjusted p values are derived from the Stepdown Bonferroni method for multiple comparisons. Bold: p < 0.05. Bold italics: p < 0.01. ABC adaptive behavior composite, CGI clinical global impression, Cr creatine, CSF cerebrospinal fluid, GIx glutamatergic metabolites, NAA N-acetylaspartate, NEFL neurofilament light chain, PEA proximal extension assay,  $Simoa^{TM}$  single molecule array, UBDRS Unified Batten Disease Rating Scale.

scores (PEA:  $r_p=-0.74$ ,  $[-0.89,\ -0.44]$ ,  $p_{\rm adj}=0.001$ ; ELISA:  $r_p=-0.54$ ,  $[-0.79,\ -0.14]$ ,  $p_{\rm adj}=.04$ ) and with Glx markers level (PEA:  $r_p=-0.63$ , [-0.84,-0.26],  $p_{\rm adj}=0.01$ ; ELISA:  $r_p=-0.62$ ,  $[-0.83,\ -0.24]$ ,  $p_{\rm adj}=0.02$ ) in the PGM. CSF NEFL levels measured by ELISA showed the most correlations (Fig. 3). In addition to those seen with PEA, CSF NEFL levels by ELISA also inversely correlated with PGM Cr  $(r_p=-0.58,\ [-0.81,\ -0.18],\ p_{\rm adj}=0.02)$  and NAA  $(r_p=-0.60,\ [-0.82,\ -0.21],\ p_{\rm adj}=0.02)$  MR spectroscopy measurements. Serum NEFL levels showed relations with all but PGM Cr outcome measures; however, they were only retained with UBDRS physical  $(r_p=0.65,\ [0.30,\ 0.84],\ p_{\rm adj}=0.01)$  and UBDRS capability  $(r_p=-0.60,\ [-0.82,\ -0.23],\ p_{\rm adj}=0.02)$  scores after adjustment for multiple comparisons.

We used a weighted combined score of all seven items in the UBDRS clinical summary subdomain in this study to incorporate the scores for all relevant symptoms related to CLN3 disease. Since prior publications (Fig. S8) only used individual CGI item scores, we also performed correlation analyses using only the single-item overall CGI score. The latter method yielded slightly lower correlation coefficients and larger CIs and *p* values (Fig. S8), reflecting the decreased variabilities resulting from using a more discrete CGI value set. However, the outcomes and conclusions described above did not change.

#### DISCUSSION

While much progress has been made in designing and refining quantitative assessments to characterize disease progression in individuals with CLN3, opportunities remain for identification of additional measures that are objective and accessible, with a potential for sensitivity to reflect short-term changes. Here, we show that cross-sectional CSF NEFL level in a cohort of pediatric study participants with CLN3 reflects clinical state as assessed by disease rating scale, adaptive behavior evaluation, and brain MR spectroscopy. Furthermore, the correlations hold for NEFL level in corresponding serum samples from individuals with CLN3. This latter finding is particularly important and applicable in the pediatric population as serum samples are relatively more feasibly obtained from both affected and unaffected children.

Prior work identifying CLN3 biomarkers awaits additional validation before translation into clinical application. 13-15 Lebrun et al.<sup>14</sup> performed microarray analysis on lymphocytes from eight individuals homozygous for the common 1-kb deletion variant. They confirmed top candidate genes in cerebellar precursor cells from  $CbCln3^{\Delta ex7/8}$  mice and Cln3 small interfering RNA (siRNA)treated HeLa and SH-SY5Y cells. NEFL RNA expression level decreased by threefold in lymphoblasts from individuals with CLN3 compared with that from similarly aged healthy controls. This decrease was present only in individuals classified as having a slow, and not in those with a rapid or average, disease progression. A paradoxically decreased messenger RNA (mRNA) level, in the setting of increased NEFL protein level, has also been observed in spinal cord tissue from individuals with amyotrophic lateral sclerosis.<sup>35</sup> The excess NEFL protein, in combination with another protein member of the neurofilament complex, forms intracellular accumulation that is thought to interfere with normal axonal transport activity. 19 It is unclear whether this contributes to a negative feedback regulation of NEFL mRNA expression.

Hersrud et al.<sup>13</sup> used immunoassays, two-dimensional difference gel electrophoresis, and western blotting to analyze plasma samples from individuals with CLN3 versus those from healthy controls of similar ages. NEFL was not one of the analytes in their list of candidate biomarkers. Lack of inclusion of NEFL on the immunoassay panels or of method sensitivity for detecting a neuronally derived protein in peripheral blood samples are two possible explanations for why changes in NEFL level was not reported. Sleat et al.<sup>15</sup> interrogated postmortem brain tissue and ventricular CSF from individuals with CLN3, compared with

postmortem samples from older unaffected individuals, using untargeted mass spectrometry. NEFL was also not identified as a candidate biomarker through this approach. Several factors may contribute to this including lack of age-similar controls, as NEFL level increases with increasing age. <sup>36,37</sup> The half-life of transgenic human and innately expressed NEFL protein in mice ranges from months to weeks, <sup>17,18</sup> thus NEFL degradation should not be an explanation for its absence on the candidate biomarker list. As the authors alluded to, biomarker levels from this experiment reflect the end-stage time point of the disease, when perhaps certain pathophysiological changes were no longer present. <sup>15</sup>

Most recently, Kuper et al.<sup>38</sup> demonstrated correlations of CLN3 disease state to lymphocyte vacuoles and lysosomal associated membrane protein 1 (LAMP1) expression in human blood. The vacuole-related measures were higher in samples from individuals with classic than those with vision-only CLN3 presentation, and higher than those from individuals without CLN3. LAMP1 level in lymphocytes also correlated with CLN3 disease state, but not with vacuole-related measures. In addition, LAMP1 expression pattern differed in the CD20-positive B-lymphocytes compared with the CD4/CD8 + T-lymphocytes. Based on these findings, the authors have begun to incorporate LAMP1 assay in their diagnosis of CLN3 disease. As these measures lack correlation with disease progression, further research is needed to assess their relevance to other CLN3 outcome measures and application in clinical trials.<sup>38</sup>

Elevation in NEFL level, both in CSF and blood, has been observed in multiple adult neurodegenerative conditions compared with healthy controls. The typical magnitude of NEFL increase ranges from 228.9 pg/mL (Alzheimer dementia) to 9285 pg/mL (amvotrophic lateral sclerosis) in CSF, and 23 pg/mL (Alzheimer and Parkinson) to 296 pg/mL (sporadic Creutzfeldt–Jakob) in blood.<sup>24</sup> Very few studies have examined NEFL levels in pediatric neurodegenerative diseases. Even fewer evaluate CSF NEFL in affected or similarly aged control groups. Wong et al.<sup>27</sup> showed elevated serum NEFL levels in children with acquired demvelinating syndromes (36.1 pg/mL) versus age-matched controls with no specific neurological disorder (6.1 pg/mL). They showed good correlation between the CSF and serum NEFL levels in the affected group but did not compare CSF samples with an age-matched control group. Also using serum samples, Ru et al.<sup>25</sup> reported significantly elevated NEFL levels in children with late-infantile/CLN2 disease (79.8-388.1 pg/mL) compared with age-similar controls (2.1-5.5 pg/mL). Using CSF samples from pediatric and adult individuals with clinically isolated syndrome of neuroinflammatory nature, van der Vuurst de Vries et al.<sup>39</sup> proposed that high CSF NEFL level suggested a severe neurodegenerative process and is predictive of progression to clinically definite multiple sclerosis. They based the hypothesis partly on measured CSF NEFL level of 4888 pg/mL in the pediatric clinically definite multiple sclerosis group compared with 2683 pg/mL in the pediatric clinically isolated syndrome group after adjusting for age. While no pediatric CSF control samples were measured, the NEFL level in unaffected adult CSF controls was 444 pg/mL.<sup>39</sup> In a rare pediatric study using historical CSF controls, Olsson et al.<sup>40</sup> showed that children with spinal muscular atrophy type 1 had untreated CSF NEFL levels of  $4598 \pm 981$  pg/mL compared with  $148 \pm 39$  pg/mL in the age-similar historical controls with nonspecific neurologic presentation.

Compared with these studies, CSF NEFL levels of the pediatric laboratory controls in our study are high, likely reflecting the acute pathological processes that necessitate a workup involving lumbar puncture. CSF NEFL levels in the non-neurodegenerative cohorts, CTD and SLOS, are similar to those reported for adult<sup>24</sup> and pediatric<sup>40</sup> controls. Serum NEFL levels in the unaffected pediatric healthy siblings control, CTD, and SLOS groups in this study are within the ranges previously reported for pediatric controls. <sup>25,27</sup> This suggests that CSF and serum samples from pediatric non-neurodegenerative conditions may be considered for use as

comparators, given the general limitation on available samples from healthy, unaffected pediatric individuals.

CSF and serum NEFL values in the CLN3 cohort are clearly elevated above levels reported for pediatric or adult controls, and in the ranges of those for neurodegenerative conditions. Proximal extension assay appears to be more discriminant at the lower end, whereas ELISA is more at the higher end, of NEFL level detection. Of note, participant SP5.2.2 with genotype, history, and evaluation findings consistent with a vision-only phenotype has CSF and plasma NEFL levels lower than others in the cohort and in the range of normal values. This suggests that NEFL level may be an additional useful quantitative measure for delineating the phenotypic spectrum of *CLN3*-related disorders. Interestingly, the magnitude of NEFL elevation in CSF and serum samples from the CLN3 cohort appears to be less than those seen in conditions with more severe presentation and earlier onset such as CLN2 disease<sup>25</sup> and spinal muscular atrophy type 1.<sup>40</sup>

In addition to correlating with respective disease severity scale measurements, elevated NEFL level also reflects findings on brain imaging. Higher NEFL level correlated with more disordered or abnormal white matter tract parameters in amyotrophic lateral sclerosis, 41 with subsequent decrease in brain volume and greater number of contrast-enhancing lesions in multiple sclerosis, 27,39,42 and decreased baseline and higher atrophy rate of brain volume in Alzheimer dementia. AEFL has also been shown to reflect treatment effect, i.e., decreasing following one or multiple doses of experimental pharmacologic agents. In our study, NEFL levels negatively correlate with MR spectroscopy markers for healthy neurons. Correlation of NAA, Glx and Cr spectroscopy levels with disease severity has been reported in infantile NCL and will be described for CLN3 in a separate report.

While we describe here the largest number of clinically wellcharacterized CLN3 CSF and serum samples evaluated for NEFL level to date, the relatively small size and cross-sectional nature are limitations to this study. While CSF NEFL level appears more sensitive in reflecting disease outcome measures the findings of high correlation between CSF and serum NEFL levels, and among serum NEFL level and clinical outcome measures, suggest a feasible approach for enlarging both the affected and control cohorts. Continuation of longitudinal follow up and sample collection in natural history studies will allow evaluations of the long-term trends of NEFL level in CLN3 disease, including investigating whether NEFL level decreases as neurons die as part of the neurodegenerative process. This does not appear to be the case in this cohort as NEFL level positively correlated with markers of more severe disease. NEFL is not a specific biomarker for CLN3 disease based on its response pattern in multiple other neurological diseases. However, as noted above, further characterization of the magnitude and range of NEFL expression may help to distinguish among conditions by their disease course and age of onset. 25,39,40 NEFL level may also be an early marker for response to treatment.<sup>25,40</sup>

Data from this study suggest that CSF NEFL level strongly reflects neurologically based clinical outcome measures in CLN3. This portends a role for following CSF NEFL level as an objective, quantitative, longitudinal outcome measure in future clinical trials. Furthermore, correlation of CSF and serum NEFL level with the UBDRS physical and capability domains suggests clinical validity of this biomarker, and the potential for serum NEFL as a minimally invasive testing option for monitoring disease progression. We anticipate that the ongoing natural history study (NCT03307304), and similar efforts for collecting biospecimens that are accompanied by extensive phenotyping of the affected individuals, will provide further insights into the applicability of NEFL as a biomarker for CLN3 disease.

#### DATA AVAILABILITY

The data that support the findings of this study are available from the corresponding author upon reasonable request.

Received: 16 June 2020; Revised: 23 October 2020; Accepted: 27 October 2020:

Published online: 26 November 2020

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#### **ACKNOWLEDGEMENTS**

We dedicate this work to the study participants, their families, and the support organizations for the motivation and inspiration they have provided. We thank Jonathan W. Mink (University of Rochester Medical Center) for his expert inputs on UBDRS implementation. We thank colleagues and staff who enabled the conduct of this study and the preparation of the manuscript. The National Institutes of Health (NIH) Intramural Research Program of NICHD, National Institute of Allergy and Infectious Diseases (NIAID), National Institute of Mental Health (NIMH), the NIH Clinical Center, National Institute of Neurological Disorders and Stroke (NINDS), and an NIH Clinical Center Bench-to-Bedside Award supported this work.

# **AUTHOR CONTRIBUTIONS**

Conceptualization: A.D.D., E.H.B, A.E.T., B.B., F.D.P.; Data curation: A.D.D., N.S., R.R.M., E.H.B., A.E.T., A.G.S.; Formal analysis: A.D.D., N.S., R.R.M.; Funding acquisition: F.D.P.; Investigation: A.D.D., E.H.B, A.E.T, A.G.S, S.E.B., F.D.P.; Methodology: all authors; Supervision: F.D.P.; Writing – original draft: A.D.D, N.S., R.R.M; Writing – review and editing: all authors.

# **COMPETING INTERESTS**

The authors declare no Competing interests.

# **ETHICS DECLARATION**

We evaluated study participants and collected biospecimens as part of natural history studies approved by the *Eunice Kennedy Shriver* National Institute of Child Health and Human Development (NICHD) Institutional Review Board (CLN3 [NCT03307304]; creatine transporter deficiency [CTD; NCT02931682]; Smith–Lemli–Opitz syndrome [SLOS; NCT00001721]; Niemann–Pick disease, type C [NCT00344331]). The main inclusion criteria for CLN3 disease study participants is having pathogenic variants in *CLN3*, with no restriction on disease phenotype. Parents or guardians and participants older than 7 years of age provided consent and assent, respectively. We provided deidentified participant-level data. The study adhered to the principles set out in the Declaration of Helsinki.

# **ADDITIONAL INFORMATION**

The online version of this article (https://doi.org/10.1038/s41436-020-01035-3) contains supplementary material, which is available to authorized users.

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