

1 Article

# 2 A web-based calculator for prediction of severe 3 neurodevelopmental impairment in preterm infants 4 using clinical and imaging characteristics

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10

11 **Abstract:** Although the most common forms of brain injury in preterm infants have been associated  
12 with adverse neurodevelopmental outcomes, existing MRI scoring systems lack specificity, do not  
13 incorporate clinical factors, and are technically challenging to perform. The objective of this study  
14 was to develop a web-based, clinically-focused prediction system which differentiates severe from  
15 normal-moderate neurodevelopmental outcomes at two years. Infants were retrospectively  
16 identified as those who were born  $\leq 30$  weeks gestation, had MR imaging at term-equivalent age,  
17 and neurodevelopmental testing at 18-24 months. Each MRI was scored on injury in three domains  
18 (intraventricular hemorrhage, white matter injury, and cerebellar hemorrhage) and clinical factors  
19 strongly predictive of outcome were investigated. A binary logistic regression model was then  
20 generated from the composite of clinical and imaging components. A total of 154 infants were  
21 included (mean GA =  $26.1 \pm 1.8$  weeks, BW =  $889.1 \pm 226.2$  grams). The final model (imaging score +  
22 ventilator days + delivery mode + antenatal steroids + ROP requiring surgery) had strong  
23 discriminatory power for severe disability (AUC=0.850), with a PPV of 76% and NPV of 90%.  
24 Available as a web-based tool, it can be useful for prognostication and targeting early intervention  
25 services to infants who may benefit most from such services.

26 **Keywords:** cerebellar hemorrhage; intraventricular hemorrhage; preterm; MRI;  
27 neurodevelopment; outcome prediction; white matter injury

28

## 29 1. Introduction

30 Brain injury is a common and consequential outcome of prematurity. Preterm infants are  
31 affected by three forms of brain injury: intraventricular hemorrhage (IVH), white matter injury  
32 (WMI), and cerebellar hemorrhage (CH) [1], all of which have been associated with an increased risk  
33 of adverse neurodevelopmental outcomes [2–4]. Although the routine cranial ultrasound is ideal  
34 for the detection of intraventricular hemorrhage [5], and may have utility at term-equivalent age for  
35 the detection of WMI [6], the brain MRI remains the gold standard, with significantly greater  
36 sensitivity for the detection of injury [7].

37

38 However, for any imaging modality to have value it must first meet two criteria – ease of use,  
39 and reliable prediction of neurodevelopmental outcomes. Four major MRI scoring systems have  
40 been developed for preterm infants by Woodward et al. [3] Kidokoro et al. [8], Chau et al. [9], and  
41 Brouwer et al [10]. All four systems have strong correlations with adverse outcome, but are complex  
42 to perform, requiring precise measurements, *qualitative assessment* by experienced radiologists, brain  
43 segmentation, and/or measurement of diffusion or fractional anisotropy. Furthermore, all of the  
44 systems are based on imaging alone and do not incorporate clinical factors which may be separately  
45 predictive of adverse outcomes.

46 Although these approaches have a high negative predictive value (NPV) for infants without  
47 evidence of injury [3,11], they have very poor positive predictive value (PPV) for those with injury,  
48 ranging between 10 and 50% [3,12]. Not surprisingly, considerable opposition from families has  
49 developed as to the utility of the term-equivalent MRI due to the lack of precision in predicting  
50 outcome of infants with injury [13]. This ultimately led to an AAP recommendation against routine  
51 use of term-equivalent MRI in preterm infants [14].

52

53 To overcome these challenges, an ideal scoring system would be user-friendly, account for  
54 supratentorial and cerebellar injury, incorporate clinical factors linked to adverse outcomes, and  
55 differentiate infants with severe neurodevelopmental delay from those with normal-moderate  
56 outcomes with a maximal degree of precision. The objective of this study was to develop a scoring  
57 system using a cross-sectional cohort of preterm infants with term-equivalent MRI, accounting for  
58 clinical risk factors, and validate the system against formal neurodevelopmental testing at 18-24  
59 months of age. This model was then incorporated into a web-based calculator, which will be useful  
60 for prognostication and targeting early intervention services to infants who may benefit most from  
61 such services.

62

## 63 **2. Materials and Methods**

### 64 *2.1. Patient selection*

65 Infants included in this study represent a cross-sectional population of all preterm infants  
66 admitted to the NICU at St. Louis Children's Hospital. Inclusion criteria for the cohort were preterm  
67 birth ( $\leq 30$  weeks estimated gestational age [EGA]) and admission to the NICU at our institution  
68 between 1 January 2007 and 31 December 2016. Infants were excluded if there was a known  
69 congenital anomaly, if the infant died before term-equivalent age, or if he/she was lost to follow-up  
70 prior to neurodevelopmental testing. Term-equivalent brain MRI and formal neurodevelopmental  
71 testing between 18- and 24-months corrected age using the Bayley Scales of Infant Development, 3<sup>rd</sup>  
72 edition (BSID-III) were performed in all infants as a part of standard clinical care.

73

74 The study protocol was reviewed and approved by the Washington University Human Research  
75 Protection Office.

76

### 77 *2.2. Data collection*

78 Demographic and perinatal factors collected included gestational age at birth, birth weight, sex,  
79 race, intrauterine growth restriction, pre-eclampsia, chorioamnionitis (diagnosed by histopathology),  
80 mode of delivery, emergent delivery, administration of antenatal steroids and/or magnesium sulfate,  
81 and the Apgar score at 5 minutes. Clinical characteristics included diagnosis of bronchopulmonary  
82 dysplasia (BPD, defined as need for supplemental oxygen after 36 weeks corrected gestational age),  
83 ventilator days, inotropic medication administration, sepsis (positive blood culture), necrotizing  
84 enterocolitis, presence of clinically apparent seizures, and severe retinopathy of prematurity (defined  
85 as stage III disease with need for laser ablative surgery).

86

### 87 *2.3. Imaging scoring system*

88 All infants underwent standardized cranial ultrasound screening consisting of scans performed  
89 at least once in the first three days of life, again between 7 and 10 days of life, and again at 30 days of  
90 life. Of note, infants with grade III/IV IVH frequently received more cranial ultrasound exams as a  
91 result of weekly surveillance for post-hemorrhagic hydrocephalus.

92

93 All infants in the study underwent a non-sedated, non-contrast MRI scan at term equivalent age,  
94 including T1, T2 and susceptibility-weighted imaging (SWI) sequences. Magnetic resonance images  
95 were acquired by using a 3-T TIM Trio system (Siemens, Erlangen, Germany). MRI scanning included  
96 anatomic images obtained with an axial magnetization-prepared rapid gradient echo T1-weighted

97 sequence (TR/TE 1500/3 milliseconds; voxel size:  $1 \times 0.7 \times 1 \text{ mm}^3$ ) and a turbo spin echo T2-weighted  
 98 sequence (TR/TE 8600/160 milliseconds; voxel size:  $1 \times 1 \times 1 \text{ mm}^3$ ; echo train length: 17).  
 99

100 Cerebellar hemorrhage was identified as a hypointensity in the cerebellum on T2 sequences with  
 101 corresponding lesion on SWI. Intraventricular hemorrhage was classified using the Papile system  
 102 [5]. White matter injury was identified as hyperintensity on T1 sequences with corresponding  
 103 hypointensity on T2 sequences. Diffusion-weighted imaging was not used in the scoring system.  
 104 All imaging was interpreted by a clinical neuroradiologist at the time of scan, who was blinded to the  
 105 clinical course of the infant, and later reviewed by one author (ZAV) to confirm findings.  
 106

107 The proposed scoring system consists of three components: IVH score, WMI score and CH score.  
 108 IVH was classified as none, low-grade (grade I/II), and high-grade (grade III/IV). WMI was  
 109 classified as none, isolated punctate ( $\leq 2$  lesions), or multiple punctate or cystic. CH was classified  
 110 as none, punctate/small ( $<50\%$  of cerebellar hemisphere), or large ( $>50\%$  of cerebellar hemisphere)  
 111 with additional points given for bilateral CH.

112 **Table 1.** MRI Scoring System

Cerebellar hemorrhage size	<ul style="list-style-type: none"> <li>• <math>&gt; 50\%</math> of cerebellar hemisphere – 3 points</li> <li>• Punctate up to <math>&lt;50\%</math> of cerebellar hemisphere – 1 point</li> <li>• None – 0 points</li> </ul>
Cerebellar hemorrhage laterality	<ul style="list-style-type: none"> <li>• Bilateral – 1 point</li> <li>• Unilateral – 0 points</li> </ul>
Intraventricular hemorrhage	<ul style="list-style-type: none"> <li>• Grade III/IV – 5 points</li> <li>• Grade I/II – 2 points</li> <li>• No IVH – 0 points</li> </ul>
White matter injury	<ul style="list-style-type: none"> <li>• Multiple punctate (<math>&gt; 2</math> lesions) or Cystic – 5 points</li> <li>• Isolated punctate (<math>\leq 2</math> lesions) – 2 points</li> <li>• None – 1 point</li> </ul>

113 In order to develop the scoring system, infants were first sorted by neurodevelopment outcome.  
 114 Infants were divided into two groups, those with severe neurodevelopmental impairment (any one  
 115 BSID-III component greater than 2 standard deviations below the mean [ $<70$ ]) and those with normal-  
 116 moderate outcomes (all BSID-III components  $>70$ ). An iterative score-weighting process was  
 117 conducted, starting with “baseline” scoring system where all injury components had equal weight  
 118 (e.g. 0 points for absent, 1 point for present). Using the difference in distribution of radiographic  
 119 features in the severe group vs. normal-moderate group, the weight of each individual feature was  
 120 adjusted (by increasing point values) until the sensitivity and specificity were maximized. The  
 121 scoring system is shown in **Table 1**.  
 122

#### 123 2.4. Statistical approach

124 Characteristics of infants with and without severe neurodevelopmental impairment were  
 125 compared using Fisher’s Exact Test for categorical variables and the Mann-Whitney U-test for  
 126 continuous variables. Comparisons were considered significant where  $p < 0.05$ . Two variations of  
 127 the base clinical risk score were created. The first variation (“full model”) was generated as a  
 128 multivariate binary logistic regression model using parameters where  $p < 0.10$  in univariate analysis  
 129 and factors known to be associated with adverse neurodevelopmental outcomes in previous studies.

130 The second variation (“slim model”) was created by entering all collected clinical variables into  
 131 backwards stepwise logistic regression by Akaike Information Criterion (AIC) to generate the most  
 132 parsimonious model, maximizing discriminatory power while minimizing risk of over-fitting.

133

134 A composite multivariate logistic regression model was then constructed by adding the imaging  
 135 score to the base clinical score. The variance inflation factor (VIF) was calculated for all covariates  
 136 in each model to assess for excessive collinearity (defined as  $VIF > 5$ ). The area under the curve (AUC)  
 137 was then calculated for both models and variations to assess the degree of improvement in  
 138 discrimination with the addition of the imaging score. DeLong’s test for correlated ROCs was then  
 139 performed to evaluate if the improvement in AUC was statistically significant.

140

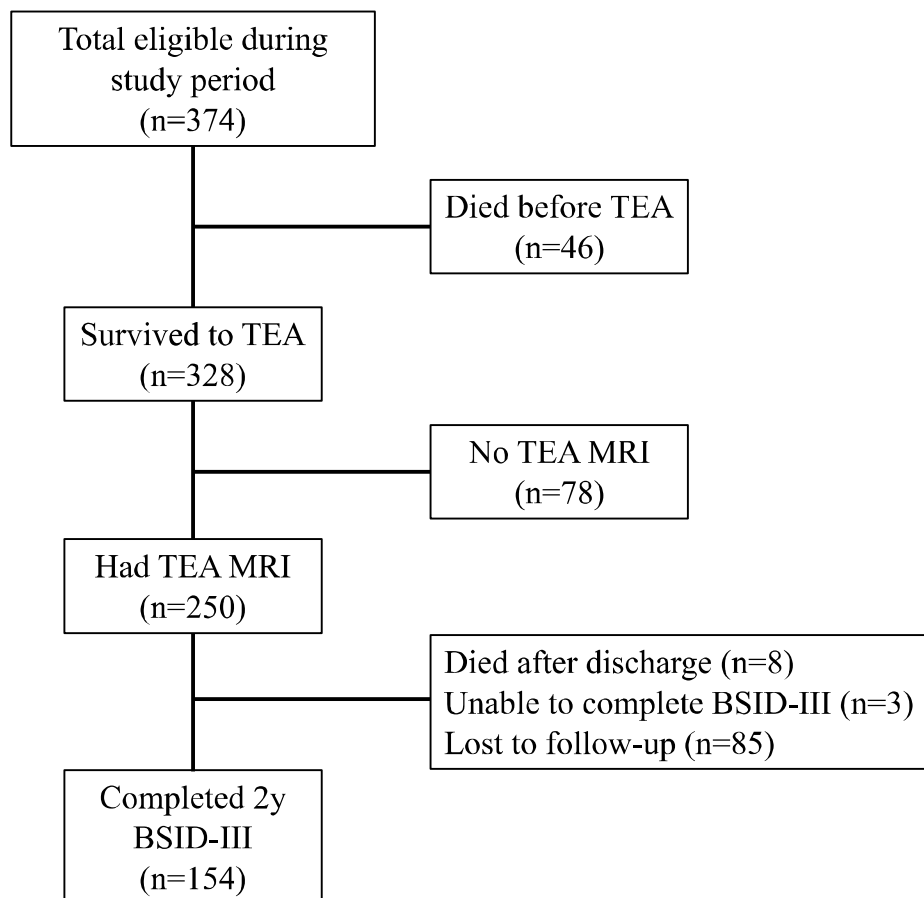
141 All statistical testing was performed using R version 3.5.1 (R Foundation for Statistical  
 142 Computing, Vienna, Austria). ROC testing and plots were performed using the pROC package for  
 143 R [15]. The online calculator was developed using the Shiny package for R.

144

### 145 3. Results

#### 146 3.1. Sample characteristics

147 A total of 374 eligible infants were admitted during the study period. Of those, 328/374 (88%)  
 148 survived to term-equivalent age and 250/328 (76%) underwent a brain MRI. At two years, 8/250 (3%)  
 149 of infants had died and 3/250 (1%) had such severe neurodevelopmental disability that they were not  
 150 able to complete the BSID-III. The BSID-III was successfully completed in 154/239 (64%) of the  
 151 remaining infants (**Figure 1**).



152

153

**Figure 1.** Flow diagram of patient selection.

154  
 155 When comparing infants with and without severe neurodevelopmental disability, those affected  
 156 were of lower EGA (25.6 vs 26.2 weeks,  $p=0.08$ ), lower birthweight (821.5 vs. 911.2 g,  $p=0.07$ ), less  
 157 likely to have received antenatal steroids (71% vs 88%,  $p=0.02$ ), had lower median 5-minute Apgar  
 158 scores (5.5 vs 6,  $p=0.09$ ), received more postnatal steroids (50% vs 31%,  $p=0.05$ ), had greater median  
 159 ventilator days (31.5 vs. 4 days,  $p<0.01$ ), received more inotropic medications (50% vs. 32%,  $p=0.05$ ),  
 160 and were more likely to have ROP requiring surgical intervention (34% vs. 18%,  $p=0.04$ ). See **Table**  
 161 **2** for complete details.

162 **Table 2.** Sample Characteristics

	No severe disability (n=116)	Severe disability (n=38)	P value
Gestational age, mean (SD), weeks	26.2 (1.9)	25.6 (1.6)	0.08
Birth weight, mean (SD), grams	911.2 (271.4)	821.5 (240.9)	0.07
SGA <sup>a</sup> , n (%)	8 (7)	5 (13)	0.31
Male sex, n (%)	53 (46)	19 (50)	0.71
Pre-eclampsia, n (%)	26 (22)	10 (26)	0.66
Chorioamnionitis, n (%)	40 (34)	11 (29)	0.56
Vaginal delivery, n (%)	30 (26)	11 (29)	0.83
Any antenatal steroids, n (%)	102 (88)	27 (71)	0.02*
Complete antenatal steroids, n (%)	57 (49)	16 (42)	0.46
Antenatal magnesium sulfate, n (%)	75 (65)	20 (52)	0.25
5-min Apgar score, median (range)	6 (0-9)	5.5 (0-9)	0.09
Postnatal steroids, n (%)	36 (31)	19 (50)	0.05
Ventilator days, median (range)	4 (0-106)	31.5 (1-251)	<0.01*
BPD <sup>b</sup> diagnosis, n (%)	70 (60)	27 (71)	0.25
Inotropic medication administration, n (%)	37 (32)	19 (50)	0.05
Culture-positive sepsis, n (%)	17 (15)	10 (26)	0.14
Necrotizing enterocolitis, n (%)	13 (11)	6 (16)	0.57
PDA ligation, n (%)	19 (16)	10 (26)	0.23
Clinically apparent seizures, n (%)	4 (3)	3 (8)	0.36
Severe ROP, n (%)	21 (18)	13 (34)	0.04*
BSID-III cognitive score, mean (SD)	91.5 (9.8)	73.3 (10.7)	<0.01*
BSID-III motor score, mean (SD)	89.7 (12.3)	65.5 (12.3)	<0.01*
BSID-III language score, mean (SD)	89.7 (10.2)	69.9 (13.3)	<0.01*

<sup>a</sup>Defined as BW < 10th centile. <sup>b</sup>Defined as need for supplemental oxygen past 36 weeks PMA.

163  
 164  
 165 **3.2. Imaging characteristics**

166 There was a statistically significant, but clinically irrelevant, difference in PMA at MRI between  
 167 the severe outcome and no severe outcome (40.4 vs 38.2 weeks,  $p=0.02$ ). Infants with severe outcomes  
 168 had a greater median number of cranial ultrasounds (8 vs. 4,  $p<0.01$ ), and a higher overall incidence  
 169 of brain injury of any type (90% vs. 66%,  $p<0.01$ ).

170  
 171 Overall, IVH of any grade was more common in infants with severe disability (82% vs. 47%,  
 172  $p<0.01$ ) as was high-grade IVH (61% vs 14%,  $p<0.01$ ). Cerebellar hemorrhage was more common in  
 173 the severe disability group, although this difference was not statistically significant (40% vs. 22%,  
 174  $p=0.06$ ). Of those with cerebellar hemorrhage, infants with severe outcome more often had large  
 175 hemorrhages (21% vs. 5%,  $p=0.03$ ) and more often had bilateral hemorrhages, although this was not  
 176 significant (24% vs 13%,  $p=0.12$ ). Infants with severe outcomes more often had WMI (68% vs 32%)  
 177 and was more often multiple punctate/cystic (63% vs.13,  $p<0.01$ ) (**Table 3**). Examples of CH and  
 178 WMI are shown in **Figure 2**.

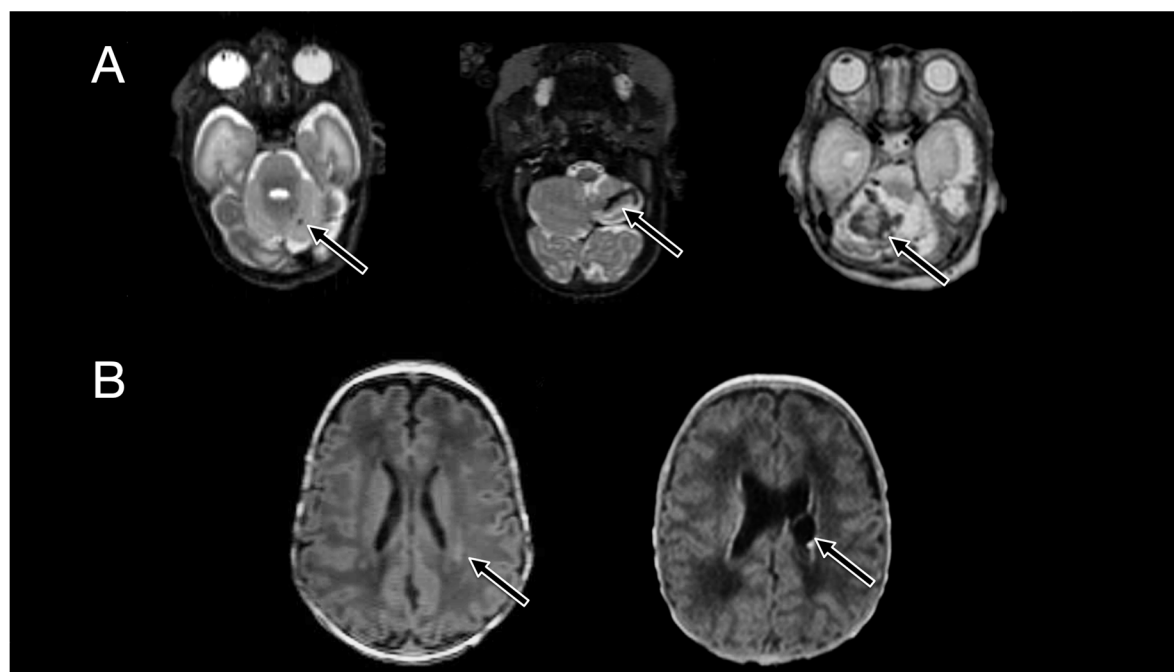
179

180

**Table 3.** Imaging Characteristics

	No severe disability (n=116)	Severe disability (n=38)	P value
Any IVH, n (%)	55 (47)	31 (82)	<0.01*
Grade III/IV IVH, n (%)	16 (14)	23 (61)	<0.01*
Any cerebellar hemorrhage, n (%)	26 (22)	15 (40)	0.06
Cerebellar hemorrhage size			
Large, n (%)	6 (5)	8 (21)	0.03*
Small, n (%)	12 (10)	5 (13)	
Punctate, n (%)	8 (7)	2 (5)	
None, n (%)	90 (78)	23 (61)	
Bilateral cerebellar hemorrhage, n (%)	15 (13)	9 (24)	0.12
WMI			
Multiple punctate or cystic, n (%)	15 (13)	24 (63)	<0.01*
Isolated punctate, n (%)	22 (19)	2 (5)	
None, n (%)	79 (68)	12 (32)	
Any brain injury, n (%)	77 (66)	34 (90)	<0.01*
Number of HUS, median (range)	4 (0-28)	8 (2-38)	<0.01*
PMA at MRI	38.2 (2.6)	40.4 (5.7)	0.02*

181



182

183 **Figure 2.** Cerebellar hemorrhage examples are shown in row A: punctate injury is shown in left  
 184 column, small in the middle, and large in right column. All images are from T2 axial sequences.  
 185 Primary focus of injury shown by arrow. White matter injury examples are shown in row B: punctate  
 186 injury is shown at left while a cystic lesion is shown on the right.

### 187 3.3. Base Clinical Logistic Regression Model

188 The first variation of the base clinical model was constructed from biologically plausible and  
 189 statistically-likely (defined as  $p < 0.10$ ) factors including gestational age, birth weight, antenatal  
 190 steroids, 5-minute Apgar scores, postnatal steroids, ventilator days, inotrope use, and ROP requiring  
 191 surgical treatment. The model  $R^2$  was 0.146, with a modest AUC of 0.694, and an AIC of 132.1. The  
 192 second “slim” variation was generated by backwards stepwise multivariate logistic regression by  
 193 AIC (ventilator days, delivery mode, antenatal steroids, and ROP requiring surgery). The model  $R^2$

194 was 0.140, an improved AUC of 0.727, and an AIC 127.8. The VIF for covariates was < 5 in both  
195 variations.

196

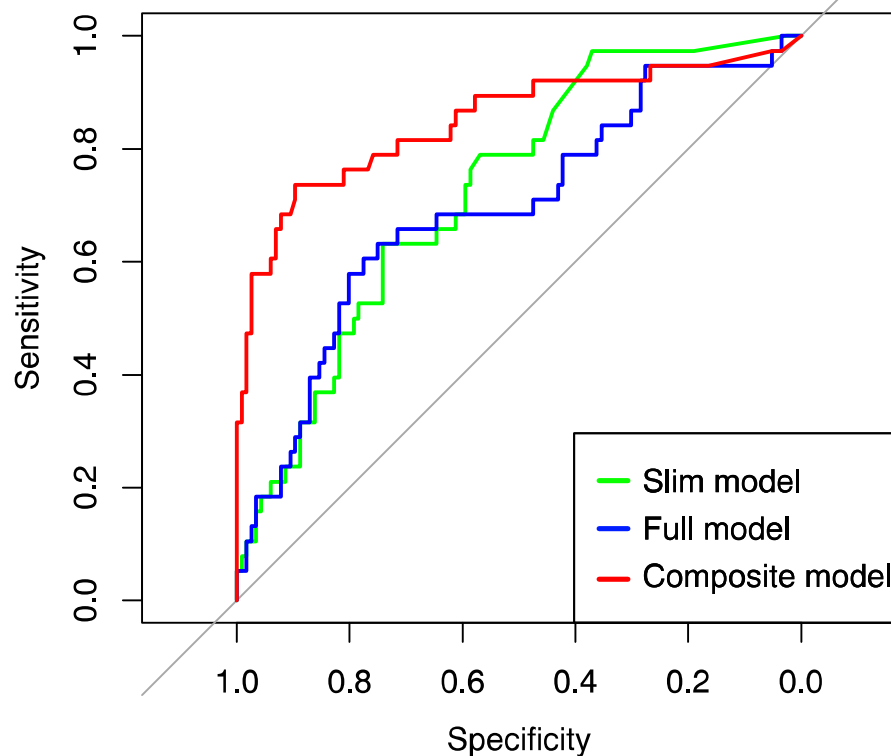
### 197 3.4. Image scoring system

198 After the iterative weighting process of individual injury components, the mean MRI score in  
199 the severe impairment group was  $8.1 \pm 3.6$  while the infants with normal-moderate outcomes had a  
200 mean score of  $3.5 \pm 2.5$  ( $p < 0.01$ ). A score threshold of  $> 8$  was 83% sensitive and 89% specific for  
201 prediction of severe delay.

202

### 203 3.5. Combined clinical and imaging logistic regression model

204 The final scoring system demonstrates the value of incorporating all aspects of preterm brain  
205 injury in an additive model in conjunction with key clinical factors. When the imaging score (CH  
206 score + IVH score + WMI score) was added to the “slim” clinical model, the composite model was  
207 strongly predictive of severe neurodevelopmental outcome. The model  $R^2$  was 0.458 with an  
208 excellent AUC of 0.850. The VIF for all covariates was < 5. The final composite model had a PPV  
209 of 76% and an NPV of 90%. ROC curves for all models and variations is shown in **Figure 3**.



210

211 **Figure 3.** ROC curves for the “full” clinical factor model (blue), “slim” clinical factor model (green),  
212 and the composite imaging and “slim” clinical model.

## 213 4. Discussion

214 In this single-center study, we have successfully developed and described a composite clinical  
215 and MRI-based scoring system, which is highly predictive of severe neurodevelopmental  
216 impairment. Novel features of this scoring system are the inclusion of clinical factors in the  
217 predictive model, the use of supratentorial and cerebellar injury, and an interactive web-based risk  
218 calculator. This scoring system is pragmatic, clinically focused, and can be accomplished by any  
219 center which utilizes term-equivalent MRI scanning in preterm infants.

220 The weighting of this scoring system reveals the importance of both cerebellar and  
221 supratentorial injury in the development of severe neurodevelopmental impairment. While the  
222 impact of all three forms of brain injury has been previously described [3,5,7,16–19], a composite  
223 system using imaging and clinical factors, validated against neurodevelopmental outcomes, has not  
224 been previously developed. While cerebellar hemorrhage has long been linked to adverse  
225 outcomes, the relationship between specific radiographic features was not known. Given that  
226 cerebellar hemorrhage is tightly linked with both IVH [20] and white matter injury [21,22], it is  
227 impossible to ever untangle the magnitude of developmental impairment caused by each discrete  
228 form of injury. As a result of under diagnosis [23], CH is not well understood and no standardized  
229 imaging scoring system exists, although it is clear that MRI is the superior radiographic approach for  
230 detection [7]. Although other authors have reported imaging findings of CH in relationship to  
231 neurodevelopmental outcomes, there is no standardized method for radiographic diagnosis of  
232 cerebellar hemorrhage. Correspondingly, this scoring system captures the composite impact of all  
233 three types of injury, enabling neurologists and neonatologists to provide informed prognostic detail  
234 to families, beyond what had previously been available.

235 There are several important limitations of this study which should be considered. Despite a  
236 relatively large initial cohort, the final group of infants was smaller. For the 220 infants excluded,  
237 three primary factors drove this exclusion – mortality (25%), no term-equivalent MRI (35%), and lost  
238 to hospital follow-up (38%). Given that the mortality rate of infants diagnosed with CH may be as  
239 high as 67% [7], mortality is a notable limitation. However, as most preterm infant who die, do so  
240 in the first 48 hours of life [24,25], this period is far too short for accurate assessment of other forms  
241 of brain injury (IVH, WMI) which evolve over longer periods of time. The ambiguous clinical utility  
242 of the term-equivalent MRI was the predominant driving factor behind the lack of MR imaging,  
243 both a limitation of the study and further evidence of the vital need for a more predictive scoring  
244 system. Given the scope of the underlying cohort (nearly 400 infants over nearly 10 years), and  
245 characteristics of infants at greatest risk for brain injury (very preterm, severe lung disease, high  
246 mortality rates) it is challenging to identify, scan, and follow-up infants in large numbers, avoiding  
247 bias as infants are excluded at each stage. However, it is reassuring that there was no difference in  
248 basic clinical characteristics between those with and without MRI (EGA 26.1 vs. 26.4 weeks,  $p=0.41$ ;  
249 BW 845 vs. 948 grams,  $p=0.21$ ; antenatal steroids 83% vs. 85%,  $p=0.65$ ) or those with and without two-  
250 year neurodevelopmental follow-up (EGA 26.3 vs. 26.8 weeks,  $p=0.21$ ; BW 919 vs. 992 grams,  $p=0.53$ ;  
251 antenatal steroids 85% vs 84%,  $p=1.00$ )

252 A possible future line of inquiry includes whether this system can be adapted to earlier MRI or  
253 non-MRI imaging. While the sum total of injury by the IVH mechanism is typically well established  
254 by the first 7-10 days of life, WMI takes much longer evolve, with many experts recommending  
255 ultrasound surveillance at 30 days of life. While all infants in this study were term-equivalent age  
256 at the time of the scan, it is possible that this system could be used at an earlier PMA. Further  
257 investigation will be needed to validate this at early gestational ages. An alternative approach could  
258 be taken with ultrasound imaging. While this methodology is simpler and less expensive, it lacks  
259 the resolution to detect punctate cerebellar and white matter lesions [23,26], essentially eliminating  
260 the bottom end of the imaging scale. Significant adaptation would be needed to overcome these  
261 challenges.

## 262 5. Conclusions

263 In conclusion, this practical, clinically-focused predictive score, which takes cerebellar and  
264 supratentorial injury into account with clinical factors, can reliably differentiate infants with normal-  
265 moderate outcomes from those with severe delay. This approach has a substantially improved PPV  
266 compared to previous systems. Available as a web-based tool, it can be useful for prognostication  
267 and targeting early intervention services to infants who may benefit most from such services.



268 **Supplementary Materials:** An interactive web-based calculator, which displays the probability  $\pm$  SE of severe  
269 outcome given clinical and MRI factors, can be accessed at: <https://wustl-neo.shinyapps.io/mri-calc/>.

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271 Halana Whitehead; Formal analysis, Zachary Vesoulis and Nathalie El Ters; Funding acquisition, Zachary  
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