# Survival of Ventilated Extremely Premature Neonates With Severe Intraventricular Hemorrhage

Kortany E. McCauley, MD,<sup>a</sup> Elise C. Carey, MD,<sup>b</sup> Amy L. Weaver, MS,<sup>c</sup> Kristin C. Mara, MS,<sup>c</sup> Reese H. Clark, MD,<sup>d</sup> William A. Carey, MD,<sup>a</sup> Christopher A. Collura, MD, MA<sup>b,a</sup>

**BACKGROUND:** Severe intraventricular hemorrhage (IVH) is a leading mortality risk factor among extremely premature neonates. Because other life-threatening conditions also occur in this population, it is unclear whether severe IVH is independently associated with death. The existence and potential implications of regional variation in severe IVH-associated mortality are unknown.

**METHODS:** We performed a retrospective cohort study of mechanically ventilated neonates born at 22 to 29 weeks' gestation who received care in 242 American NICUs between 2000 and 2014. After building groups composed of propensity score–matched and center-matched pairs, we used the Cox proportional hazards analysis to test our hypothesis that severe IVH would be associated with greater all-cause in-hospital mortality, defined as death before transfer or discharge. We also performed propensity score–matched subgroup analyses, comparing severe IVH–associated mortality among 4 geographic regions of the United States.

**RESULTS:** In our analysis cohort, we identified 4679 patients with severe IVH. Among 2848 matched pairs, those with severe IVH were more likely to die compared with those without severe IVH (hazard ratio 2.79; 95% confidence interval 2.49–3.11). Among 1527 matched pairs still hospitalized at 30 days, severe IVH was associated with greater risk of death (hazard ratio 2.03; 95% confidence interval 1.47–2.80). Mortality associated with severe IVH varied substantially between geographic regions.

**CONCLUSIONS:** The early diagnosis of severe IVH is independently associated with all-cause in-hospital mortality in extremely premature neonates. Regional variation in severe IVH-associated mortality suggests that shared decision-making between parents and neonatologists is strongly influenced by ultrasound-based IVH assessment and classification.

In critically ill neonates, severe intraventricular hemorrhage (IVH) consists of bleeding that distends the lateral ventricle (grade 3) and periventricular hemorrhagic infarction (grade 4), as detected on cranial ultrasonography.<sup>1-3</sup> Severe IVH occurs most commonly among neonates born at <29 weeks' gestation,<sup>4,5</sup> among whom it is thought to be an important factor associated with death.<sup>6,7</sup> Because overall severity of illness is associated with the development of IVH and also predisposes to death,<sup>8,9</sup> it remains unclear whether severe IVH itself is a truly independent risk factor associated with mortality.

## abstract



<sup>b</sup>Center for Palliative Medicine and <sup>a</sup>Divisions of Neonatal Medicine and <sup>a</sup>Biomedical Statistics and Informatics, Mayo Clinic, Rochester, Minnesota; and <sup>d</sup>Center for Research, Education and Quality, Pediatrix Medical Group, Sunrise, Florida

Drs McCauley, E.C. Carey, W.A. Carey, and Collura conceptualized and designed the study, interpreted the data, and drafted and revised the manuscript; Ms Weaver and Ms Mara designed and conducted the statistical analyses, interpreted the data, and drafted the manuscript; Dr Clark conceptualized the study, acquired the data, interpreted the data, and critically reviewed and revised the manuscript; and all authors approved the final manuscript as submitted and are accountable for all aspects of the work and the accuracy and integrity of all data as presented.

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Address correspondence to Christopher A. Collura, MD, MA, Division of Neonatal Medicine, Mayo Clinic, 200 First St SW, Rochester, MN 55905. E-mail: collura.christopher@mayo.edu

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**To cite:** McCauley KE, Carey EC, Weaver AL, et al. Survival of Ventilated Extremely Premature Neonates With Severe Intraventricular Hemorrhage. *Pediatrics*. 2021;147(4):e20201584 When death does occur in neonates with severe IVH, it often follows a shared decision to provide comfort care and discontinue life-sustaining medical treatment (LSMT).<sup>7,8,10,11</sup> To the extent that cranial ultrasonography informs this decision-making, it is troubling that interrater variability in the ultrasound assessment of IVH<sup>12-15</sup> and classification of severe IVH according to a 4-stage scale<sup>14,16,17</sup> limits the prognostic value of this screening test. Studies reveal a wide range of low positive predictive values for ultrasound-diagnosed severe IVH regarding neurodevelopmental impairment (17%-61%) and cerebral palsy (11%–49%).<sup>4,7,9,10,14,16</sup> Regional variation in end-of-life care intensity suggests that provider beliefs and patient and family characteristics influence shared decision-making in adult patients.<sup>18–20</sup> There is little regional variation data to explain what impacts such decisions for neonates.<sup>21</sup> Thus, it remains unclear what influences parents and neonatologists as they decide whether to continue LSMT in the setting of severe IVH.<sup>22-27</sup>

To resolve these knowledge gaps, we studied a large cohort of mechanically ventilated neonates aged <29 weeks' gestation, hypothesizing that the presence of grade 3 or grade 4 IVH on the early bedside ultrasound would be associated with greater all-cause inhospital mortality, irrespective of overall illness severity. To ascertain whether provider and/or parental decision-making might underlie any observed difference in survival between neonates with and without severe IVH, we conducted subgroup survival analyses of patients from 4 geographic regions of the United States.

## **METHODS**

## **Study Design**

We performed a retrospective cohort study using data from the Clinical

Data Warehouse (CDW). The CDW contains the demographic and clinical information of >1 million neonates who were hospitalized in a Pediatrix Medical Group (PMG) NICU.<sup>28</sup> The Mayo Clinic Institutional Review Board (Rochester, MN) deemed this study exempt because the data set provided was deidentified.

## **Study Setting and Population**

We gueried CDW data tables to identify neonates who had been admitted to a PMG NICU for intensive care; thus we excluded those who died in the delivery room or who had been admitted for comfort measures only. Among these patients, we included in our study neonates who were born at 22 to 29 weeks' gestation, diagnosed with at least 1 form of respiratory distress, and discharged between January 1, 2000, and December 31, 2014. We then excluded neonates with major congenital anomalies, those who were outborn, those who required neither conventional nor high-frequency ventilation on days of life 0 to 2, and those without documented neurologic imaging or a documented grade of IVH on days of life 0 to 7.

## Patient Characteristics and Outcomes

We obtained a variety of maternal and neonatal characteristics (Table 1) for each patient, including age and IVH grade at the time of the patient's maximum IVH grade within the first 7 days of life. We defined severe IVH as a maximum grade 3 or 4 hemorrhage; patients with no hemorrhage (grade 0) or with a maximum grade 1 or 2 hemorrhage were considered not to have severe IVH. The primary outcome was all-cause in-hospital mortality (hereafter mortality), defined as death before transfer or discharge; clinician-documented cause of death was not included in the CDW data set. Secondary outcomes were necrotizing enterocolitis (NEC); retinopathy of prematurity that required treatment

during the index hospitalization (tROP); chronic lung disease (CLD), defined as a supplemental oxygen requirement or pressure-supported ventilation at 36 weeks' corrected gestational age (CGA); and periventricular leukomalacia (PVL).

## **Data Analysis**

We used propensity score (PS) matching to reduce the imbalance of measured baseline characteristics between patients with and without severe IVH during the first 7 days of life.<sup>29</sup> The PS was defined as the probability of a patient having severe IVH, given a set of 25 baseline covariates, as estimated by using a multivariable logistic regression model (Table 1, Supplemental Fig 4). For each patient with severe IVH, 1 patient was randomly selected from the pool of patients with a grade 0 to 2 hemorrhage who met the matching criteria. Patients were matched on (1) the logit of the PS by using calipers of width equal to 0.2 SD of the logit of the PS, (2) the day of life (0-7) on which their maximum IVH status was diagnosed, (3) the gestation status (singleton or multiple-gestation pregnancy), and (4) the center. We assessed covariate imbalance between those with and without severe IVH by evaluating the standardized difference for each baseline covariate. The standardized difference for a continuous covariate was defined as the absolute difference in group means divided by an estimate of the pooled SD. The derivation was similar for nominal covariates. A standardized difference <0.1 denoted negligible covariate imbalance between the 2 groups.<sup>30</sup>

We used a Cox proportional hazards model to assess the association between IVH severity status and mortality. We used age as the time scale, with patients entering the risk set at their age at the index date,<sup>31</sup> which we defined as the day of life (0–7) on which maximum IVH status was diagnosed. We used the counting TABLE 1 Baseline Characteristics of Full and Matched Cohorts by Severity of IVH

Characteristic		Full Col	nort	Matched Cohort		
	Severe IVH	Nonsevere IVH	Standardized Difference	Severe IVH	Nonsevere IVH	Standardized
	(n = 4679)	(n = 27993)		(n = 2848)	(n = 2848)	Difference
Maternal characteristics, n (%)						
Prolonged ROM	613 (13.1)	5008 (17.9)	0.133	442 (15.5)	426 (15.0)	0.016
Oligohydramnios	60 (1.3)	467 (1.7)	0.032	48 (1.7)	47 (1.7)	0.003
Antenatal steroids given	3136 (67.0)	23 010 (82.2)	0.354	2092 (73.5)	2120 (74.4)	0.022
Infant characteristics						
Age at maximum IVH grade, d, n (%)						
0	1651 (35.3)	9103 (32.5)	—	1305 (45.8)	1305 (45.8)	—
1	496 (10.6)	2475 (8.8)	—	249 (8.7)	249 (8.7)	—
2	704 (15.0)	2339 (8.4)	—	313 (11.0)	313 (11.0)	—
3	554 (11.8)	2699 (9.6)		255 (9.0)	255 (9.0)	
4	358 (7.7)	1802 (6.4)	—	166 (5.8)	166 (5.8)	
5	241 (5.2)	16/3 (6.0)	—	110 (3.9)	110 (3.9)	_
D 7	200 (0.4)	2319 (8.3)	_	149 (0.2) Z01 (10.0)	149 (0.2)	_
1 Reasingtony discinguis ánous n (%)	422 (9.0)	5565 (19.9)	—	301 (10.0)	301 (10.6)	
Pneumonia	214 (4.6)	1301 (46)	0.004	1/15 (5 1)	178 (63)	0.050
Pneumonia and PPHN	214 (4.0)	57 (0.2)	0.004	11 (0.4)	8 (0.3)	0.000
PH	41 (0.9)	140 (0.5)	0.002	28 (10)	22 (0.8)	0.010
PH and PPHN	28 (0.6)	101 (0.4)	0.034	16 (0.6)	14 (0.5)	0.020
RDS	3981 (85.1)	25 597 (91.4)	0.199	2496 (87.6)	2473 (86.8)	0.024
RDS and PPHN	391 (8.4)	797 (2.8)	0.241	152 (5.3)	153 (5.4)	0.002
Gestational age, mean (SD), wk	25.2 (1.8)	26.7 (1.8)	0.836	25.5 (1.7)	25.5 (1.7)	0.019
Gestational age, wk, n (%)						
22	81 (1.7)	87 (0.3)	—	14 (0.5)	17 (0.6)	—
23	763 (16.3)	1143 (4.1)	—	296 (10.4)	307 (10.8)	—
24	1123 (24.0)	2863 (10.2)	—	624 (21.9)	602 (21.1)	_
25	873 (18.7)	3739 (13.4)	—	559 (19.6)	595 (20.9)	—
26	725 (15.5)	4387 (15.7)	—	520 (18.3)	515 (18.1)	—
27	536 (11.5)	4960 (17.7)	—	401 (14.1)	392 (13.8)	
28	350 (7.5)	5603 (20.0)	—	263 (9.2)	269 (9.4)	_
29	228 (4.9)	5211 (18.6)		171 (6.0)	151 (5.3)	
Birth wt, mean (SD), kg	0.79 (0.24)	0.93 (0.27)	0.543	0.83 (0.24)	0.82 (0.24)	0.042
Birth Size assessment, n (%)	490 (105)	3043 (14 1)	0.111	Z10 (11 0)	373 (13 1)	0.066
	409 (10.3) 3815 (81.5)	21 000 (78 G)	0.111	2206 (80 G)	2257 (70.2)	0.000
	375 (80)	21333 (10.0)	0.074	2230 (00.0)	2237 (13.2)	0.034
Sex n (%)	070 (0.0)	2001 (1.0)	0.151	240 (0.4)	210 (1.1)	0.020
Female	1865 (39.9)	13 254 (47.3)		1207 (42.4)	1209 (42.5)	
Male	2812 (60.1)	14 734 (52.6)	_	1640 (57.6)	1638 (57.5)	_
Unknown	2 (0.0)	5 (0.0)	_	1 (0.0)	1 (0.0)	_
Race, <i>n</i> (%)						
White	2073 (44.3)	12912 (46.1)	0.037	1296 (45.5)	1271 (44.6)	0.018
Asian American	106 (2.3)	773 (2.8)	0.032	62 (2.2)	44 (1.5)	0.047
Black	1276 (27.3)	7380 (26.4)	0.020	763 (26.8)	803 (28.2)	0.031
Hispanic	983 (21.0)	5351 (19.1)	0.047	580 (20.4)	583 (20.5)	0.003
Other	241 (5.2)	1577 (5.6)	0.021	147 (5.2)	147 (5.2)	0.000
Calendar year, <i>n</i> (%)			0.129			0.026
2000–2004	1448 (30.0)	7083 (25.3)	—	1037 (36.4)	972 (34.1)	_
2005–2009	1695 (36.2)	10 528 (37.6)	—	1013 (35.6)	1071 (37.6)	—
2010-2014	1536 (32.8)	10.382 (37.1)	0.075	798 (28.0)	805 (28.3)	
Bir'th number, <i>n</i> (%)	7707 (70 A)	00.005 (77.0)	0.035	0005 (70 1)	000E (70 1)	0.000
	3381 (12.4)	20030 (13.3) 700 (00 1)	_	2223 (18.1) 607 (01.0)	2220 (/ð.1) 607 (01 0)	_
∠⊤ Surfactant divon n (%)	1232 (21.0)	1230 (20.1) 01 370 (07 1)	0.020	020 (21.9) 0407 (07 7)	020 (21.9) 0516 (00 Z)	0.071
CMV or HEOV n (%)	4102 (00.J)	24012 (01.1)	0.000	2401 (01.3)	2010 (00.0)	0.001
CMV	2028 (43.3)	19665 (702)	0.004	1453 (51.0)	1462 (51.3)	0.000
HFOV	2651 (56.7)	8328 (29.8)	_	1395 (49.0)	1386 (48.7)	_
At least 1 vasopressor reported on days 0–3, $n$ (%)	2591 (55.4)	7499 (26.8)	0.607	1362 (47.8)	1383 (48.6)	0.015

AGA, appropriate for gestational age; CMV, conventional mechanical ventilation; HFOV, high-frequency oscillatory ventilation; LGA, large for gestational age; PH, pulmonary hypoplasia; PPHN, persistent pulmonary hypertension; RDS, respiratory distress syndrome; ROM, rupture of membranes; SGA, small for gestational age; —, not applicable.

process formulation of a Cox model; patients entered the analysis at their index age (left truncation) and exited at their death, transfer, or discharge age. We summarized associations using the hazard ratio (HR) and corresponding 95% confidence interval (CI).

We employed the same time-to-event analysis methods to assess NEC as a secondary outcome. For the other secondary outcomes, we identified separate PS-matched subcohorts of patients who were eligible for assessment of these conditions. For tROP, we restricted the starting cohort to patients with retinopathy of prematurity (ROP) evaluated; for CLD, we restricted the starting cohort to patients still in the hospital at 36 weeks' CGA; and for PVL, we restricted the starting cohort to patients with documented brain imaging. We evaluated the association between IVH severity and each of these 3 secondary outcomes using logistic regression. We summarized associations using the odds ratio (OR) and corresponding 95% CI.

All calculated *P* values were 2 sided, and *P* values <.05 were considered statistically significant. Statistical analyses were performed by using SAS version 9.4 software (SAS Institute, Inc, Cary, NC) and R version 3.4.2 (R Core Team, R Foundation for Statistical Computing, Vienna, Austria).

## **Regional Subgroup Analyses**

Regional differences in provider beliefs and practices and in patient and family characteristics underlie regional variation in end-of-life decision-making.<sup>18–20</sup> We therefore stratified patients into 4 geographic regions, as defined in the National (Nationwide) Inpatient Sample (NIS).<sup>32</sup> Within each region, we used the same strategy as our primary analysis to create a matched cohort of patients with and without severe IVH. Given the smaller sample sizes, a standardized difference threshold <0.25 denoted acceptable covariate imbalance.<sup>30</sup> For each region, we used a Cox proportional hazards model to assess the association between IVH severity status and mortality. We then compared the 2 regions to the highest and lowest disparity in mortality risk by evaluating the interaction between region and IVH status in a Cox model. We also performed a sensitivity analysis in which we created 2 PSmatched subsets, (1) with severe IVH and (2) without severe IVH, from the same 2 regions. For each subset, the association between region and mortality was evaluated by fitting a Cox model.

## **RESULTS**

There were 92635 neonates born at 22 to 29 weeks' gestation who were diagnosed with at least 1 form of respiratory distress and discharged from PMG NICUs between 2000 and 2014. As shown in Fig 1, patients were sequentially excluded because of the presence of major congenital anomalies; outborn status; no requirement for mechanical ventilation on days of life 0 to 2: and no documentation of neurologic imaging, grade of IVH, age at maximum IVH grade on days of life 0 to 7, or age >7 days at maximum IVH grade. The resulting analysis cohort thus was composed of 32672 neonates from 242 PMG NICUs; baseline characteristics are shown in Table 1. Neonates with severe IVH were less likely to have been exposed to antenatal steroids, were born more premature and at a lower weight, and were more likely to require highfrequency ventilation and receive at least 1 vasopressor medication in the first days of life. As shown in Fig 2A, incremental increases in IVH grade were associated with an increased risk of mortality in the unmatched cohort.

## Primary Analysis: Outcomes of Severe IVH

From the analysis cohort of 32 672 neonates, we created matched groups

that each contained 2848 patients and were balanced for all measured covariates (Table 1, Supplemental Fig 4A). Nearly half of the patients included in our analysis required high-frequency ventilation or vasopressor support. Among patients in the severe IVH group, 1030 died at a median age of 7.5 days (interquartile range: 3.5-17.5 days), whereas 440 of those without severe IVH died at a median age of 13.5 days (interquartile range: 5.5-28.5 days). Neonates with severe IVH were significantly more likely to die compared with those without severe IVH (Fig 2B). A landmark analysis restricted to the 1527 matched pairs in which both patients in the pair were alive and still in the hospital at 30 days revealed that severe IVH also was associated with greater mortality beyond 30 days of life (Fig 2C).

To determine if survival might vary depending on the grade of severe IVH, we separated patients with severe IVH from the matched cohort into those with grade 3 (n = 1169) or grade 4 (n = 1679) hemorrhages. Neonates with either grade 3 or grade 4 hemorrhages were more likely to die than were matched neonates without severe IVH (grade 3 IVH: HR 1.76 [95% CI 1.45-2.14]; grade 4 IVH: HR 3.54 [95% CI 3.09-4.06]). The landmark analysis revealed that this survival disparity persisted after 30 days of life only for those with grade 4 hemorrhages (grade 3 IVH [n = 760]matched pairs]: HR 1.40 [95% CI 0.86-2.28]; grade 4 IVH [n = 767 matched pairs]: HR 2.68 [95% CI 1.72-4.17]).

Severe IVH was not associated with an increased risk of NEC (HR 1.09; 95% CI 0.94–1.26). Among the secondary outcomes shown in Table 2, severe IVH was associated only with a higher rate of PVL (OR 4.52; 95% CI 3.53–5.80). Please refer to Supplemental Fig 4 B–D to see the standardized differences in baseline characteristics for the tROP, CLD, and



#### FIGURE 1

Consolidated Standards of Reporting Trials flow diagram. CMV, continuous mandatory ventilation; HF0V, high-frequency oscillatory ventilation.

PVL analysis groups (all below the 0.1 threshold).

## Secondary Analysis: Regional Survival in Severe IVH

From the analysis cohort of 32 672 patients, we created matched groups of patients with and without severe IVH for each of 4 NIS regions: Northeast (n = 60 each), Midwest (n =332 each), West (n = 854 each), and South (n = 1467 each). As was the case in our primary survival analysis, these region-specific groups were balanced for all measured covariates (Supplemental Table 3) and matched for center. In all 4 regions, neonates with severe IVH were more likely to die than those without severe IVH (Fig 3). Among paired regional comparisons, the greatest difference in severe IVH-associated mortality risk was observed between the West and the Midwest (West: HR 4.27 [95% CI 3.39-5.37]; Midwest: HR 1.78 [95% CI 1.28-2.48]; P < .001).

To further investigate the above difference between the West and Midwest regions, we conducted a sensitivity analysis in which we directly compared the survival of patients from these 2 regions according to IVH status. To do so, we created 2 matched subsets with severe IVH (n = 465 each from the West and Midwest) and without severe IVH (n = 3112 each from the West and Midwest) that were balanced for all measured covariates (Supplemental Table 4). Patients with severe IVH in the West were more likely to die than those in the Midwest (HR 1.52; 95% CI 1.25-1.85), whereas survival among those without severe IVH did not vary between the regions (HR 0.87; 95% CI 0.72-1.04).

## **DISCUSSION**

We conducted this study to determine the extent to which severe



FIGURE 2

A–C, Overall survival by severity of IVH for patients in the full cohort (N = 32672 patients) (A), matched cohort (n = 2848 matched pairs) (B), and landmark cohort, which was restricted to 1527 matched pairs in which both patients were still alive and in the hospital at 30 days (C).

IVH is associated with mortality in extremely premature neonates. To begin, we impaneled the largest known cohort of neonates <29 weeks' gestation whose natural, allcause mortality was described according to IVH status. In this overall cohort, the prevalence of severe IVH (14.3%) was similar to that of other cohorts in large retrospective cohort studies<sup>4,5</sup> and suggests an annual incidence of ~5000 cases in the United States.<sup>33</sup> Given that 50% of the patients in the matched cohort had severe IVH and 1470 patients died, we had 80% power to detect a HR

≥1.16. Having controlled for a variety of maternal and neonatal characteristics, including markers of overall illness severity, we found that severe IVH was independently associated with an increased risk of mortality (HR 2.79). Among all extremely premature neonates who

TABLE 2 Comparison of Secondary Outcomes by Severity of IVH in the Matched Cohort

	Severe IVH	Nonsevere IVH	OR (95% CI)	Р
ROP treated				
No. neonates with ROP evaluated	2250	23 077		_
No. matched pairs used in analysis	1470	1470	_	_
No	1274 (86.7%)	1294 (88.0%)	_	_
Yes	196 (13.3%)	176 (12.0%)	1.13 (0.91–1.41)	.27
CLD				
No. neonates still in hospital at ≥36 wk CGA	1880	18 174	_	_
No. matched pairs used in analysis	1168	1168	_	_
No	493 (42.2%)	500 (42.8%)	_	_
Yes	675 (57.8%)	668 (57.2%)	1.03 (0.87-1.21)	.77
PVL				
No. neonates with imaging	4510	30 135	_	_
No. matched pairs used in analysis	2841	2841	_	_
No	2508 (88.3%)	2760 (97.2%)	_	_
Yes	333 (11.7%)	81 (2.9%)	4.52 (3.53–5.80)	<.001
160	000 (11.170)	01 (2.370)	4.02 (0.00-0.00)	<.001

—, not applicable.

died, patients with severe IVH died earlier than those without severe IVH.

Both grade 3 and grade 4 IVH were independently associated with mortality (HR 1.76 and 3.54, respectively). To put this in context with other morbidities affecting extremely premature neonates, these mortality HRs are similar to those seen in patients with early evidence of pulmonary hypertension (HR 2.0) and those with NEC (HR 2.67).<sup>34,35</sup> We also found that grade 4 IVH was associated with greater mortality among patients who survived the first 30 days of life. This increased risk could be due to complications of posthemorrhagic hydrocephalus or ventriculoperitoneal shunt placement,<sup>7</sup> although we do not know the prevalence of these variables in our cohort. We also compared the risks of 4 secondary outcomes associated with long-term neurodevelopmental compromise (NEC, CLD, tROP, and PVL).<sup>36-40</sup> Consistent with previous observations, severe IVH was associated with an increased risk of PVL.<sup>37</sup> The similar risks of NEC, CLD, and tROP observed among patients with and without severe IVH likely resulted from survivorship bias.

Although we could not directly assess cause or mode of death in this study, 3 pieces of evidence suggest that severe IVH-associated mortality in our cohort was due to withdrawal of LSMT, as others have established.<sup>7,8,11</sup> First, in the overall cohort, approximately half of the 14.3% of patients diagnosed with severe IVH died before transfer or discharge (Fig 2A), similar to the proportion of deaths caused by IVH in a subset of 641 patients included in our analyses (9.4%).<sup>6</sup> Second, the median age of death for patients with severe IVH was 7.5 days, nearly 1 week earlier than patients without severe IVH and within days of maximum-grade IVH diagnosis. Last, we observed regional differences in mortality, suggesting that provider and/or parental decision-making may have informed the decision to withdraw LSMT for patients with severe IVH. Providers' beliefs and practices are known to underlie regional variation in the intensity of care at the end of life, <sup>18–20</sup> and there is evidence that rates of LSMT discontinuation differ among the NIS regions.<sup>41</sup> Although these regional comparisons have important implications for future study of neonatal outcomes and decisionmaking in the NICU, we must acknowledge that the geographic distribution of PMG NICUs influenced the outcomes of the primary analyses (eg, overrepresentation of hospitals in the South and underrepresentation of hospitals in the Northeast).

In this study, we only included patients who required mechanical ventilation on days of life 0 to 2. Although this limits the patient population to which our findings may be generalized, a more rigorous matching strategy (eg, requiring the same mode of ventilation on the day the maximum IVH grade was diagnosed) would have prevented us from creating cohorts balanced for other important covariates. It is also important to note that uninformative patient characteristics were excluded from the PS model. For example, some variables were highly collinear (eg, maximum fraction of inspired oxygen and mode of ventilation) and others were common to patients with and without severe IVH (echocardiographic assessment of PDA: 49.9% and 49.5%, respectively).

The maximum IVH grade and diagnosis of PVL were derived from all clinical reports generated during routine clinical care for each PMG NICU patient. We were unable to know whether a neonatologist or pediatric radiologist provided a given grade or diagnosis or whether independent readings were performed to yield final consensus interpretations. Likewise, we were unable to know why some patients did not receive a graded neurologic



**FIGURE 3** 

A–D, Overall survival by severe IVH of patients in the matched cohort for the Northeast (A), the Midwest (B), the West (C), and the South (D). The survival estimates were derived from a Cox model, with patients entering the risk set at their age at the index date.

assessment during the first 7 days of life. It is conceivable that some providers or parents elected to forgo a cranial ultrasound because the result would not influence their decision-making. Interestingly, in the overall cohort, we found that 13.3% of patients in the Midwest had no IVH grade assigned. In a post hoc analysis in which we considered all Midwest patients without neurologic imaging to have severe IVH, we observed an increased risk differential between those with severe IVH and those without, further suggesting that a cranial ultrasound was unlikely to influence decision-making in this region.

Last, we did not have access to patient-level data regarding IVH laterality or the size and location of hemorrhages. A post hoc review of all CDW patients <29 weeks' gestation revealed bilateral severe IVH in 68% of patients with maximum grade 3 IVH and in 59% of patients with maximum grade 4 IVH. Determining if laterality influences survival would be particularly important for patients with grade 4 IVH because the neurodevelopmental consequences of unilateral and bilateral hemorrhage are drastically different.<sup>14</sup>

We strongly encourage the validation of more refined ultrasound classification systems for IVH and periventricular hemorrhagic infarction made possible with advances in ultrasound technologies.<sup>42,43</sup> By improving our understanding of prognosis in severe IVH, we can better support neonatologists and their patients' parents when they engage in difficult, but indicated, discussions about limiting LSMT.<sup>44–46</sup>

## **CONCLUSIONS**

The early diagnosis of severe IVH is independently associated with mortality in extremely premature neonates. Regional differences in survival suggest that neonatologists and/or families emphasize the presence of severe IVH when deciding whether to continue LSMT, irrespective of overall severity of illness. Given the apparent importance of severe IVH in end-oflife decision-making, there is a need for tools that improve the predictive value of cranial ultrasound results. Such tools, coupled with a provider's clinical expertise and parental perspectives on their child's outcomes,<sup>47,48</sup> could better inform goals of care and help navigate shared decision-making for extremely premature neonates.49,50

## **ABBREVIATIONS**

CDW: Clinical Data Warehouse CGA: corrected gestational age CI: confidence interval CLD: chronic lung disease HR: hazard ratio IVH: intraventricular hemorrhage LSMT: life-sustaining medical treatment NEC: necrotizing enterocolitis NIS: National (Nationwide) Inpatient Sample OR: odds ratio PMG: Pediatrix Medical Group PS: propensity score PVL: periventricular leukomalacia ROP: retinopathy of prematurity tROP: retinopathy of prematurity that required treatment during the index hospitalization

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