INTRODUCTION

In severe cases of bronchopulmonary dysplasia (BPD), patients may be candidates for tracheostomy. It is estimated that 13,000 patients develop severe BPD annually, with 5% requiring tracheostomy [1, 2]. Tracheostomy is considered in BPD infants when it is anticipated that high-level respiratory support will be needed for a prolonged period of time due to respiratory insufficiency, upper or lower airway abnormalities, or a combination of these [3–6]. The long-term impact of tracheostomy placement on respiratory and neurodevelopmental outcomes is not well established.

All preterm infants are at risk for childhood respiratory morbidity and neurodevelopmental impairment (NDI) with increased likelihood in patients with severe BPD [7]. It is recommended that tracheostomy be placed by term to limit the physical risks associated with repeated intubations as well as decrease the risk of NDI [3]. Although a number of studies have examined childhood pulmonary function [8–11] and neurodevelopmental [12, 13] outcomes in BPD, few have directly compared BPD patients with history of tracheostomy (tBPD) to severe BPD patients who do not receive tracheostomy (sBPD) [3, 14].

This study examines the childhood respiratory and neurodevelopmental outcomes of severe BPD patients with and without tracheostomy in a large, contemporary US cohort from a single tertiary/quaternary care center. We hypothesize that tBPD will have decreased childhood lung function and worse NDI compared to sBPD patients without tracheostomy.

MATERIALS/SUBJECTS AND METHODS

Subject identification

Subjects were identified using the Boston Children’s Hospital (BCH) Preterm Lung Patient Registry [15], active since 2008, with additional subjects added to the tracheostomy group by medical record review. The patient registry included 1068 former preterm infants with gestational age <37 weeks who were seen in the pulmonary clinic (August 26, 2020 download). Prospectively enrolled Patient Registry subjects completed informed consent, with a small subset of subjects enrolled under a waiver of consent for retrospective review. Subjects were excluded if they had known genetic or congenital causes of their respiratory disease, including congenital cyanotic heart disease. To expand the population of subjects with BPD and history of tracheostomy, an additional search was performed using i2b2 [16] to identify subjects based on the International Classification of Diseases diagnosis codes in the BCH electronic medical record.

Severe BPD was defined as having used ≥28 days of respiratory support in the neonatal intensive care unit (NICU) and using ventilation, continuous positive airway pressure, or high flow nasal cannula at 36 weeks corrected gestational age (CGA) [17]. History of tracheostomy placement was identified in the Patient Registry or i2b2 search and confirmed by medical record review. Medical record data for subjects’ initial NICU admissions were collected including birth characteristics, NICU treatments, and information about NICU discharge. Chart review and BCH HoundDog [18], a natural language processing search tool, was used to identify each subject’s relevant comorbidities.

OBJECTIVE: The long-term morbidity among children with severe bronchopulmonary dysplasia who require tracheostomy (tBPD) relative to those without tracheostomy (sBPD) is not well characterized. We compared childhood lung function and neurodevelopmental outcomes in tBPD and sBPD.

STUDY DESIGN: Retrospective case-control study of N = 49 tBPD and N = 280 sBPD subjects in Boston Children’s Hospital Preterm Lung Patient Registry and medical record. We compared NICU course, childhood spirometry, and neurodevelopmental testing.

RESULT: tBPD subjects were more likely than sBPD to be Black, have pulmonary hypertension, and have subglottic stenosis. tBPD subjects had lower maximal childhood FEV1 % predicted (β = −0.14) and FEV1/FVC (β = −0.08); spirometry curves were more likely to suggest fixed extrathoracic obstruction. tBPD subjects had greater cognitive and motor delays <24 months, and greater cognitive delays >24 months.

CONCLUSION: Compared to subjects with sBPD who did not require tracheostomy, tBPD subjects suffer from increased long-term impairment in respiratory function and neurodevelopment.
Table 1. Demographic and NICU course data in BPD subjects with and without history of tracheostomy.

|                                | tBPD       | sBPD       | P-value |
|--------------------------------|------------|------------|---------|
|                                | n = 49     | n = 280    |         |
| Male (%)                       | 32/49 (65.3) | 167/280 (59.6) | 0.53    |
| **Race/ethnicity**             |            |            | 0.01<sup>a</sup> |
| White (%)                      | 30/47 (63.8) | 175/280 (70.0) |         |
| Black (%)                      | 14/47 (29.8) | 47/250 (18.8) |         |
| Asian (%)                      | 1/47 (2.1)  | 28/250 (11.2) |         |
| Hispanic/Latino (%)            | 5/40 (12.5)  | 38/262 (14.5) | 1.00    |
| Mean gestational age, weeks (SD) | 26 6/7 (2.4/7) | 26 4/7 (2.2/7) | 0.35    |
| Mean birth weight, grams (SD)<sup>b</sup> | 862.5 (378.3) | 842.3 (434.5) | 0.78    |
| Mean year of birth (range)     | 2007.1 (1993–2013) | 2011.4 (2001–2019) | <0.001<sup>a</sup> |
| **Multiples**                  |            |            | 0.51<sup>c</sup> |
| Singleton (%)                  | 35/49 (71.4) | 177/269 (65.8) |         |
| Twin (%)                       | 12/49 (24.5) | 73/269 (27.1) |         |
| Triplet (%)                    | 2/49 (4.1)  | 14/269 (5.2)  |         |
| Other (%)                      | 0/49 (0.0)  | 5/269 (1.9)   |         |
| Mean NICU length, days (SD)<sup>b</sup> | 209.39 (143.6) | 135.31 (141.2) | 0.02<sup>a</sup> |
| **NICU treatments**            |            |            |         |
| Surfactant (%)                 | 34/38 (89.5) | 241/275 (87.6) | 1.00    |
| Post-natal steroids (%)        | 23/30 (76.7) | 117/247 (47.4) | 0.01<sup>a</sup> |
| Diuretics (%)                  | 23/31 (74.2) | 179/239 (74.9) | 1.00    |
| G-Tube (%)                     | 36/42 (85.7) | 74/267 (27.7) | <0.001<sup>a</sup> |
| Ventilation (%)                | 39/39 (100.0) | 268/280 (95.7) | 0.37    |
| CPAP (%)                       | 21/32 (65.6) | 276/279 (98.9) | <0.001<sup>a</sup> |
| LFNC (%)                       | 7/32 (21.9)  | 212/272 (77.9) | <0.001<sup>a</sup> |
| Tracheostomy placed in NICU (%)| 23/26 (88.5) | –         | –       |
| Median age, months (range)<sup>b</sup> | 3.7 (1.8–28.5) | –         | –       |
| Median CGA, weeks (range)      | 41.7 (33.1–147.7) | –         | –       |
| Tracheostomy placed post-NICU (%) | 3/26 (11.5) | –         | –       |
| Median age, months (range)<sup>b</sup> | 16.0 (11.0–59.8) | –         | –       |
| Median CGA, weeks (range)      | 93.6 (75.1–280.6) | –         | –       |
| Median length of tracheostomy placement, years (range)<sup>b</sup> | 2.5 (1.0–5.5) | –         | –       |
| **Respiratory support on discharge (%)** | 30/33 (90.9) | 161/271 (59.4) | <0.001<sup>a</sup> |
| Ventilation (%)                | 22/30 (73.3) | 0/160 (0.0)  | <0.001<sup>a</sup> |
| CPAP (%)                       | 7/30 (23.3)  | 30/160 (18.8) |         |
| LFNC (%)                       | 1/30 (3.3)   | 130/160 (81.4) |         |
| **Treatments used on discharge** |            |            |         |
| Albuterol (%)                  | 15/31 (48.4) | 26/245 (10.6) | <0.001<sup>a</sup> |
| Chlorothiazide (%)             | 11/31 (35.5) | 98/252 (38.9) | 0.85    |
| Furosemide (%)                 | 9/30 (30.0)  | 94/251 (37.5) | 0.55    |
| **Comorbidities**              |            |            |         |
| Subglottic stenosis (%)        | 31/49 (63.3) | 11/279 (3.9)  | <0.001<sup>a</sup> |
| Pulmonary hypertension (%)     | 18/49 (36.7) | 57/280 (20.4) | 0.02<sup>a</sup> |
| PDA (%)                        | 26/37 (70.3) | 211/276 (76.5) | 0.42    |
| IVH Grade 3/4 (%)              | 2/34 (5.9)   | 22/119 (18.5) | 0.12    |

Positive respondents/total respondents.

BPD bronchopulmonary dysplasia, tBPD BPD with history of tracheostomy, sBPD severe BPD without history of tracheostomy, NICU neonatal intensive care unit, G-Tube gastronomy tube, CPAP continuous positive airway pressure, LFNC low flow nasal cannula, PDA patent ductus arteriosus, IVH intraventricular hemorrhage

<sup>a</sup> P < 0.05.
<sup>b</sup> Response missing for some subjects.
<sup>c</sup> Analysis comparing singleton birth to non-singleton birth.
Table 2. Childhood best spirometry results in BPD subjects with and without history of tracheostomy.

|            | tBPD| sBPD| β         | 95% CI     | P-value |
|------------|-----|-----|-----------|------------|---------|
| Mean FEV₁, pp (SD) | 70.7 (23.6) | 85.3 (14.7) | -14.16 | (-23.64, -4.68) | 0.01<sup>b</sup> |
| Mean FVC pp (SD) | 94.5 (27.0) | 107.0 (16.8) | -13.58 | (-27.96, 0.80) | 0.06 |
| Mean FEV₁/FVC (SD) | 72.2 (14.1) | 81.9 (8.9) | -8.23 | (-15.72, -0.74) | 0.03<sup>b</sup> |

BPD: bronchopulmonary dysplasia, tBPD: BPD with history of tracheostomy, sBPD: severe BPD without history of tracheostomy, FEV₁: forced expiratory volume in one second, FVC: forced vital capacity, pp: percent predicted.

<sup>a</sup> Controlled for gestational age and multiple gestations.

<sup>b</sup> P < 0.05.

<sup>c</sup> Only includes subjects with acceptable FVC.

### Pulmonary function

Pre-bronchodilator spirometry was performed on a Medisoft SpiroAir<sup>®</sup> machine (Sorinnes, Belgium). Data was recorded in and extracted from a Medical Record Search tool identified subjects who had visited the BCH NICU Growth and Development Support Programs (NICU GraDS) for neurodevelopmental follow-up testing using the Bayley Scales of Infant Development-III (Bayley) [21]. The BCH HoundDog [18] natural language processing search tool was used to identify subjects who had completed Bayley testing and medical record review was used to collect individual scores. The subject’s CGA at the time of testing was determined. Their composite scores for cognitive abilities and scaled scores for gross motor and fine motor were collected.

### Neurodevelopmental assessment

Subjects with tBPD were compared to sBPD based on birth characteristics, NICU treatments, NICU comorbidities, NICU discharge information, tracheostomy placement, and decannulation using univariate analysis with chi-square or independent sample t-tests. We compared mean Bayley scores for testing done at <12 months CGA, 12–23.99 months CGA, and ≥24 months CGA with independent sample t-tests. Bin sizes for different age and domain stratifications were limited and there was insufficient power to perform a regression analysis. Analyses were performed on IBM SPSS Statistics for Macintosh Version 26.0 [22].

Childhood best spirometry was compared using multivariable linear regression adjusted for gestational age and multiple gestations run as singleton vs. non-singleton births. Analysis was performed using R v3.5.2 (2018-12-20) [15].

### RESULTS

#### Subject demographics and NICU course

A total of 329 subjects were identified for inclusion, 49 tBPD and 280 sBPD (Table 1). Among tBPD subjects, 39 were from the Patient Registry and 10 were identified by medical record review. All sBPD subjects were from the Patient Registry. Compared to those with sBPD, tBPD subjects were more likely to be of Black race and, on average, were born at an earlier birth year (consistent with the use of medical review to include additional subjects, including some born before the Patient Registry was started). There were no differences in gender, Hispanic/Latino ethnicity, gestational age, birth weight, or multiple gestation status between the two groups. Analysis of NICU treatments showed significantly increased rates of post-natal steroid use, gastrostomy tube placement, respiratory support in the NICU and on discharge, and length of NICU course in tBPD subjects. On discharge, there was an increased prescription rate of albuterol of tBPD subjects compared to sBPD subjects and no differences in the prescribing rates of chlorothiazide and furosemide. There were increased comorbidities of subglottic stenosis and pulmonary hypertension among tBPD subjects compared to those with sBPD, while no significant differences were found in the percent of subjects diagnosed with Grade 3 or 4 intraventricular hemorrhage or patent ductus arteriosus. Of note, there was no difference in any comorbidity diagnoses between tBPD patients found through the Patient Registry compared to those in the medical record (Supplemental Table 1). Significantly more tBPD subjects who were diagnosed with cerebral palsy compared to sBPD subjects, though the analysis had notable limitations as described in the Supplementary Information, pg 1.

Among tBPD subjects, 88.5% had tracheostomies placed in the NICU at a median age of 3.7 months and median CGA of 41.7 weeks (Table 1). There were three tBPD subjects (11.5%) who had tracheostomies placed after NICU discharge, at a median age of 16.0 months and median CGA of 93.6 weeks, in the setting of upper airway abnormalities and respiratory infections as described in the Supplemental Material. Decannulation occurred after a median length of 2.5 years. Age at tracheostomy placement was not available for 23 of the 49 tBPD subjects and duration of tracheostomy placement was not available for 10 of the 49 tBPD subjects due to patients moving their medical home and incomplete medical record information.

### Pulmonary function

Among the subset of subjects with acceptable FEV₁ data available, 23 with tBPD and 50 with sBPD, demographics and comorbidities were compared (Supplemental Table 2). Compared to the overall population, this subset demonstrated a significant difference in the proportion of multiple gestations with tBPD subjects more likely to be a singleton birth (87.0%) than sBPD subjects (58.0%, P = 0.02). There were no significant differences between tBPD and sBPD subjects in race or rates of pulmonary hypertension. Notably, tBPD subjects were significantly older at the time of their childhood best spirometry, likely related to their earlier birth year and longer longitudinal follow-up in pulmonary clinic relative to sBPD subjects.
History of tracheostomy was associated with a significantly lower mean childhood best FEV$_1$ pp, when controlling for gestational age and multiple gestations (tBPD 70.7%, sBPD 85.3%; $\beta = -14.16$, $P = 0.01$) (Table 2). Among 17 tBPD and 30 sBPD subjects with acceptable FVC pp data available, mean FEV$_1$/FVC was significantly lower among tBPD subjects (tBPD 72.2, sBPD 81.9; $\beta = -8.23$, $P = 0.03$), while FVC pp alone approached but did not reach significance for difference between the two groups (tBPD 94.5%, sBPD 107.0%; $\beta = -13.58$, $P = 0.06$).

There were no sBPD subjects in the spirometry subset with subglottic stenosis; 19 of the 23 tBPD subjects carried this diagnosis (tBPD 82.6%, sBPD 0.0%, $P < 0.001$) (Supplemental Table 2). Among tBPD subjects, flow-volume loops assessed in blinded review identified four subjects with flattening all of whom were diagnosed with subglottic stenosis (21.1%) (Supplemental Fig. 1).

Neurodevelopment assessment
A total of 125 subjects, 16 tBPD and 109 sBPD, completed neurodevelopmental Bayley testing (Supplemental Table 3). Compared to the overall cohort, there was no longer any difference in the proportion of patients of Hispanic/Latino ethnicity or the rate of pulmonary hypertension between the two groups.

Comparison of composite Bayley scores in subjects up to three years of age across three neurodevelopmental domains was completed among 11 tBPD and 64 sBPD subjects with cognitive testing, 12 tBPD and 103 sBPD subjects with gross motor testing, and 12 tBPD and 100 sBPD subjects with fine motor testing (Supplemental Table 4, Fig. 1). Test scores for each subject by CGA at the time of the test were reported, and subjects with data from more than one testing session can appear in multiple bins. In univariate analysis cognitive, fine motor, and gross motor domain scores were significantly lower in tBPD subjects at 12-23.99 months and CGA, and cognitive scores were significantly lower at $\geq 24$ months CGA.

DISCUSSION
To the best of our knowledge, this is the largest study to assess long-term respiratory and neurodevelopmental outcomes in tBPD subjects compared to sBPD subjects without tracheostomy, including 49 tBPD and 280 sBPD subjects. Compared to sBPD infants, those with tBPD were more likely to of Black race, have longer more complicated NICU courses, and have increased comorbidities including pulmonary hypertension and subglottic stenosis. In examining long-term outcomes, tBPD subjects had decreased childhood pulmonary function, and a subset of subjects with subglottic stenosis demonstrated fixed airway obstruction suggesting an extrathoracic cause contributing to decreased FEV$_1$. In neurodevelopmental testing up to three years of age, tBPD subjects had lower scores across cognitive, gross motor, and fine motor domains. This study demonstrates the long-term increase in respiratory and neurodevelopmental comorbidity in tBPD patients compared to those with sBPD who do not require tracheostomy, which likely reflects the degree of overall disease severity in this population rather than the direct impact of tracheostomy placement itself.

Patients with tBPD represent an extreme of severe respiratory morbidity, and their long-term outcomes are an important area of research [14, 23–25]. Similar to what is seen in this cohort, previous studies have demonstrated that tBPD patients have increased gastronomy tube placement [14] and post-natal steroids administration [23] compared to sBPD patients, and are more likely to be diagnosed with comorbidities including pulmonary hypertension [24, 25]. Earlier studies have looked at outcomes in tBPD patients, but only neurodevelopmental outcomes were directly compared with a similar sBPD group [3, 14]. Comparing long-term outcomes in severe BPD patients who are a part of these two groups can help providers and families understand the course of tBPD patients.

In this study of severe BPD subjects 15% received tracheostomy. Previous studies have reported that tracheostomy is placed in 10–50% of all BPD patients, with wide variability based on institutional practices [2, 4, 26–29]. The most common reason for tracheostomy placement in premature infants is prolonged ventilator dependence followed by large airway disease including subglottic stenosis and tracheobronchomalacia [4, 23, 24]. We found that the indication for tracheostomy was complicated by prolonged ventilator dependence and the possible presence of large airway disease, making a single indication difficult to delineate. Tracheostomies in our cohort were placed at an average age of 3.7 months in the 88.5% of subjects who had them placed before NICU discharge. This was within the range reported in a two-institution study in which tracheostomies in preterm infants were placed at an average age of 3-5 months of age [4]. Three subjects with tracheostomies placed after NICU discharge who were included in this analysis.

Our study found a higher proportion of patients of Black race had tracheostomy placed. This is particularly interesting given that infants of Black race are more likely to be born preterm [30] yet have lower rates of both respiratory distress syndrome and BPD [31, 32]. A recent large prospective study of 458,624 very low birthweight infants born at 796 North American centers found that African American maternal race was an independent risk factor associated with tracheostomy placement [33]. The increased rate of tracheostomy placement in Black infants in this study could be related to increased late developing respiratory morbidity that can be seen among former preterm infants of Black race [7, 32]. The Prematurity and Respiratory Outcome Program assessed 707 former preterm infants born at <29 weeks, finding a lower rate of BPD among Black infants, but increased first year respiratory medication use, symptoms, and hospitalizations (79%
Black and 63% White). Another factor could be related to social determinants of health that influence the discussion around placement. A recent review of racial and ethnic disparities in NICU care noted that Black families reported that their requests and concerns were commonly dismissed, their decision making capacity was questioned, and that they did not feel part of the care process [34]. The experience of families from different racial and cultural backgrounds surrounding tracheostomy placement is not well described and deserves more investigation in the future.

We found that former tBPD subjects had lower lung function based on FEV₁, pp and FEV₁/FVC compared to sBPD subjects. There is limited research on the effects of history of tracheostomy for BPD patients on PFT outcomes [3]. Cristea et al. examined a cohort of 19 tBPD subjects whose PFT measurements showed severe obstructive lung disease that persisted over time, though this was not compared to sBPD [35]. By performing this comparison, we are able to draw conclusions about what might influence the decreased lung function found in the tBPD population, including the impact of subglottic stenosis.

In the visual assessment of the flow-volume loops we noted a subset of tBPD subjects with a reproducible pattern of flattened expiratory curves, which lacked an expiratory peak and had a flattened slope. The FEV₁ in these studies appeared to be reduced from upper airway obstruction, rather than lower respiratory disease. A possible explanation for this is the increased diagnoses of subglottic stenosis in the tBPD subjects, which can either be a reason for or consequence of the tracheostomy [25, 36]. Overall in this study 63.3% of tBPD subjects had subglottic stenosis; and among tBPD patients with subglottic stenosis, 21.1% exhibited flattened expiratory curves. In studies of long-term lung function in BPD that include former tracheostomy subjects, these flattened loops may make it appear that these subjects have lower respiratory function by decreasing the FEV₁ based on the upper respiratory disease rather than lower respiratory disease. Investigators should use caution when interpreting decreases in FEV₁ for these subjects.

In this cohort, tBPD patients had lower scores for cognitive, gross motor, and fine motor development at 12-23.99 months CGA, and lower cognitive scores at 2–3 years CGA. This is in concordance with earlier studies, which have shown more neurodevelopmental impairment in those with more severe BPD [12, 37]. Interestingly, Cammack et al. examined Bayley cognitive and language scores at 2–3 years of age among a cohort of 36 severe BPD patients with and without tracheostomy, finding no significant difference between the two, though they noted that both groups had profound impairment in all scales of development [13]. It may be that severe respiratory morbidity directly impacts neurodevelopment or perhaps sBPD and neurocognitive delays are independent outcomes related to a common prior antecedent associated with preterm birth. In our overall cohort, we found that post-natal steroids were administered to a greater proportion of tBPD subjects than sBPD subjects, which could contribute to increased levels of NDI seen in tBPD subjects [38]. Further analyses with longitudinal data in larger cohorts is needed to address these questions [39].

Our study represents severe BPD subjects from a single tertiary/quaternary care center with a large referral base among regional NICUs and a high rate of sBPD. This is a strength but may limit applicability as local resources and practices vary widely. The tBPD subjects had earlier birth years and there may have been in advances in technology and standards of care that are potential confounders. We were able to extract a large amount of retrospective information about the NICU course; however, there were missing data as not all care was received within our institution not all outside records were available. This made it difficult to ascertain the indication for tracheostomy and other details. It also limited our ability to examine post-NICU data including emergency visits and readmissions. Additionally, only a subset of subjects returned for pulmonary function and developmental testing, which limited the proportion of the cohort with these follow-up studies particularly among sBPD subjects; tBPD subjects were more likely to continue to follow in pulmonary clinic at older ages due to their illness severity. Ideally, we would have examined the overlapping respiratory and neurodevelopmental outcomes, however among tBPD subjects only six had both tests. In comparing long-term outcomes among this large cohort of former preterm infants with severe BPD, we found decreased lung function and more neurodevelopmental impairment among those with tBPD, which is likely related to the severity of lung disease and associated comorbidities rather than being driven by the tracheostomy itself. Future studies should be aimed at examining the complicated relationship between long-term respiratory and cognitive impairments in severe BPD. We found that Black race was associated with increased likelihood of tracheostomy placement in severe BPD, which could be driven social determinants of health and their physiologic manifestations. Among those with tBPD, we found that subglottic stenosis may be a reason for lung function to appear reduced by spirometry measurement, while actually representing a component of upper airway disease, a factor that should be considered when examining lung function in this population. By directly comparing sBPD and tBPD subjects in this cohort, this study demonstrates the impact of greater disease severity among the tBPD population, which can inform decision making and help providers and families understand the potential outcomes for this extreme population with tBPD.

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Lawrence M. Rhein, MD MPH, Department of Pediatrics, University of Massachusetts, Worcester, MA, United States.

AUTHOR CONTRIBUTIONS
C.A.A. worked on the design of the study, conducted the analysis and drafted the initial manuscript. J.C.L. aided with the conceptualization of the study, assisted with statistical analysis, and reviewed the manuscript. J.S.L. helped design the methodology and reviewed the manuscript. C.A.S. aided with investigation, provided resources, and reviewed the manuscript. L.P.H. provided supervision for the design, methodology, and analysis and provided multiple manuscript revisions.

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COMPETING INTERESTS
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