The relationship of tidal volume and driving pressure with mortality in hypoxic patients receiving mechanical ventilation

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Abstract

Purpose
To determine whether tidal volume/predicted body weight (TV/PBW) or driving pressure (DP) are associated with mortality in a heterogeneous population of hypoxic mechanically ventilated patients.

Methods
A retrospective cohort study involving 18 intensive care units included consecutive patients ≥18 years old, receiving mechanical ventilation for ≥3 days, with a PaO2/FiO2 ratio ≤300 mmHg, whether or not they met full criteria for ARDS. The main outcome was hospital mortality. Multiple logistic regression (MLR) incorporated TV/PBW, DP, and potential confounders including age, APACHE IVa® predicted hospital mortality, respiratory system compliance (C_RS), and PaO2/FiO2. Predetermined strata of TV/PBW were compared using MLR.

Results
Our cohort comprised 5,167 patients with mean age 61.9 years, APACHE IVa® score 79.3, PaO2/FiO2 166 mmHg and C_RS 40.5 ml/cm H2O. Regression analysis revealed that patients receiving DP one standard deviation above the mean or higher (≥19 cmH2O) had an adjusted odds ratio for mortality (OR_mort) = 1.10 (95% CI: 1.06–1.13, p = 0.009). Regression analysis showed a U-shaped relationship between strata of TV/PBW and adjusted mortality. Using TV/PBW 4–6 ml/kg as the referent group, patients receiving >10 ml/kg had similar adjusted OR_mort, but those receiving 6–7, 7–8 and 8–10 ml/kg had lower adjusted OR_mort.
(95%CI) of 0.81 (0.65–1.00), 0.78 (0.63–0.97) and 0.80 (0.67–1.01) respectively. The adjusted OR\textsubscript{mort} in patients receiving 4–6 ml/kg was 1.26 (95%CI: 1.04–1.52) compared to patients receiving 6–10 ml/kg.

Conclusions

Driving pressures ≥19 cmH\textsubscript{2}O were associated with increased adjusted mortality. TV/PBW 4–6ml/kg were used in less than 15% of patients and associated with increased adjusted mortality compared to TV/PBW 6–10 ml/kg used in 82% of patients. Prospective clinical trials are needed to prove whether limiting DP or the use of TV/PBW 6–10 ml/kg versus 4–6 ml/kg benefits mortality.

Introduction

Previous literature suggests that modifying the ventilator parameters, tidal volume/predicted body weight (TV/PBW) and/or driving pressure (DP), improves survival from acute respiratory distress syndrome (ARDS). However, methodological shortcomings of that literature and limitations of the diagnostic criteria for ARDS described below prevent straightforward translation of these results into population-based quality improvement.

The optimal specific approach to titrating ventilator parameters remains unclear. The most widely-recommended approach, low tidal volume ventilation (LTVV) specifically targets TV/PBW 4–6 ml/kg if tolerated by the patient, but may range up to 8 ml/kg [1, 2]. Clinical trials that support the use of LTVV largely focused on patients with ARDS and compared LTVV with high control tidal volumes ranging 10–15 ml/kg [1–8]. Tidal volumes this high are rarely clinically employed [9], and few data are available to compare LTVV with intermediate tidal volumes (ITVV) such as in the range of 8–10 ml/kg commonly used in current practice.

A meta-analysis of LTVV clinical trials suggested that driving pressure (DP), rather than TV/PBW, is the modifiable ventilator parameter independently associated with mortality in patients with ARDS [10], but prospective trials of DP-limiting ventilator management have not been performed. A clinical practice guideline endorsed by multiple international professional societies recommends LTVV for patients with ARDS [2]. Some have recommend LTVV for virtually all mechanically ventilated patients [11–13]. Others recommend a DP-limiting ventilator strategy [14, 15].

Much of the previous literature on modifiable ventilator parameters focused on patients with ARDS. However, the diagnosis of ARDS may be difficult to operationalize in clinical practice. ARDS is conceptually a clinical-pathological entity [16] diagnosed using clinical-radiological criteria [17] for which clinicians and researchers have demonstrated limited inter-rater reliability and accuracy [18–22]. Furthermore, current data suggest that limiting TV/PBW or DP may also benefit patients without ARDS [11–13, 15, 23–25], suggesting that making the diagnosis of ARDS is not essential to deciding whether to limit TV/PBW or DP. In fact, an observational study including 459 ICUs in 50 countries showed that after adjusting for potentially confounding variables, clinical recognition of ARDS did not significantly influence the choice of TV/PBW, or whether DP was measured [9]. Population-based quality improvement efforts would be greatly simplified if the necessity to distinguish patients with ARDS from others with similar hypoxic ventilatory failure could be circumvented.

Our goal has been to implement evidence-based ventilator practice in a large healthcare system to improve survival of mechanically ventilated patients. But in order to do so, we needed...
to better understand the relationship between modifiable ventilator parameters and mortality in a heterogeneous population of hypoxic mechanically ventilated patients. The specific aims of our study were: 1) To determine whether DP, TV/PBW, or subcategories of TV/PBW (4–6, 6–7, 7–8, 8–10, and >10 ml/kg) were independently associated with adjusted hospital mortality in hypoxic adult patients receiving ≥3 days of mechanical ventilation, regardless of whether they met ARDS diagnostic criteria, and 2) to establish discrete thresholds for optimal TV/PBW and/or DP.

Methods

Study design

This retrospective cohort study was performed as part of a quality improvement project, and was determined by our institution’s Research Determination Committee to not require Institutional Review Board review. The study setting included the medical/surgical, cardiovascular, neurological, transplant and trauma intensive care units (ICUs) of 18 acute care hospitals within a large healthcare system in the southwestern United States between February 1, 2017 and January 31, 2019.

Participants

Consecutive patients were included based on the inclusion criteria: ≥18 years of age, received volume control mechanical ventilation for at least three days, had a PaO\(_2\)/FiO\(_2\) ratio ≤300 mmHg while receiving PEEP ≥5 cmH\(_2\)O during the first 24 hours of mechanical ventilation, met criteria for calculation of an APACHE IVa score, had height recorded (with which to calculate PBW). Patients with less than three ventilator days were excluded in order to focus the analysis on patients more likely to accrue lung injury from prolonged mechanical ventilation. All patients were followed-up until hospital discharge or death.

Variables

The main outcome variable was hospital mortality. The two predictor variables of interest were the modifiable ventilator parameters: TV/PBW and DP. Potential confounding variables included age, PaO\(_2\)/FiO\(_2\) ratio, PaCO\(_2\), respiratory system compliance (C\(_{RS}\)), APACHE IVa\(^\text{®}\) predicted hospital mortality, hospital site, and the annual quarter in which the patient was admitted.

Data sources

We used previously described bioinformatics [26, 27] embedded within a Cerner Millenium\(^\text{®}\) electronic medical record (EMR) and an honest broker system to collect de-identified clinical and ventilator parameters on all patients receiving mechanical ventilation. These data included: age, gender, height (cm), PaO\(_2\) (mmHg), PaCO\(_2\) (mmHg), FiO\(_2\), positive end-expiratory pressure (PEEP cmH\(_2\)O), set tidal volume (ml), and plateau pressure (cmH\(_2\)O). The first complete set of data for each patient obtained within 24 hours of intubation was used in the analysis described below. We used the APACHE IVa\(^\text{®}\) severity scoring system (Cerner Corp, Kansas City MO) to enumerate hospital mortality, predicted hospital mortality and ventilator days.
Study size
We calculated that 1248 patients were needed per TV/PBW stratum (for instance comparing patients receiving 4-6ml/kg to those receiving 8-10ml/kg) to provide 80% power to discern a 5% difference in mortality, assuming baseline mortality of approximately 25%.

Statistical analysis
The following values were calculated for each patient: PaO$_2$/FiO$_2$, PBWmen = 50 + 0.91(cm of height—152.4); PBWwomen = 45.5 + 0.91(cm of height—152.4), TV/PBW, C$_{RS}$ = TV/(P$_{PLAT}$ - PEEP) (ml/cmH$_2$O) and DP = TV/C$_{RS}$ (cmH$_2$O).

The APACHE IV$^{	ext{a}}$ severity scoring system (Cerner Corp, Kansas City MO) incorporated chronic health conditions, 115 discrete admission diagnostic categories, and 27 clinical variables, including age, vital signs, Glasgow Coma Scale score, FiO$_2$, PaO$_2$, PaCO$_2$, arterial pH, urine output, creatinine, bilirubin, albumin, glucose, white blood cell count and hematocrit, with a reported a discriminant accuracy of 88% for predicting hospital mortality [28].

We performed three step-wise forward multiple logistic regression (MLR) analyses to investigate the association between TV/PBW, DP and hospital mortality with adjustment for confounders. The first MLR incorporated TV/PBW and all potential confounders listed above; the second included DP, TV/PBW and all confounders. Next we segregated patients into five strata of TV/PBW: (4–6, 6–7, 7–8, 8–10, and >10 mL/kg), chosen a-priori based on their relation to the design of multiple previous clinical trials [1–5, 11–13, 23, 29], and performed the third MLR forcing the five TV/PBW strata into the model as nominal variables, including DP and all potential confounders. We used this MLR to calculate the adjusted odds ratio for mortality (OR$_{mort}$) for each TV/PBW strata. We used the TV/PBW 4–6 ml/kg strata as the referent, based on the proposition that this strata (strict LTVV) theoretically represents best practice. In a post-hoc analysis, we combined three strata that had similar OR$_{mort}$ including tidal volumes in the 6–10 ml/kg range and used it as the referent to calculate the adjusted OR$_{mort}$ in the 4–6 ml/kg stratum.

We used the significant OR$_{mort}$ for a 1 standard deviation (SD) increase in DP to calculate a threshold DP (mean DP + 1 SD) above which adjusted mortality was significantly increased.

Post-hoc MARS and sensitivity analysis
When the relationship between TV/PBW and mortality was observed to be non-linear based on the first MLR analysis described above, we performed post-hoc multivariate adaptive regression splines (MARS) analysis of the relationship between TV/PBW and adjusted mortality.

We used STATA$^{	ext{b}}$ Version 15 (Statacorp, College Station, TX) for all statistical analyses.

Results
Our CDS system identified 21,851 discrete episodes of mechanical ventilation received by 20,703 patients during the 2-year study period. 20,057 (96.9%) of these patients received volume control mechanical ventilation, and 14,320 (72.4%) had a PaO$_2$/FiO$_2$ ratio ≤300 mmHg during the first 24 hours of mechanical ventilation. 5,658 (39.5%) of patients with a PaO$_2$/FiO$_2$ ≤300 mmHg accrued ≥3 ventilator days. Three hundred and forty-seven (6.2%) of these did not have a height recorded, and 144 (2.6%) failed to satisfy criteria for APACHE IV$^{	ext{a}}$ mortality prediction and were excluded (Fig 1).

Clinical characteristics of the 5,167 study patients are shown in Table 1. The mean age was 61.9 years, and 42.4% were women. The most common admission diagnoses were pneumonia (30.0%), non-pulmonary sepsis (10.8%), cardiopulmonary arrest (10.2%), respiratory failure.
not due to pneumonia (8.8%), and non-cardiovascular surgery (8.7%). The mean APACHE IVa score was 79.3, and mean PaO\textsubscript{2}/FiO\textsubscript{2} ratio was 166 mmHg. The mean applied TV/PBW was 7.25 ml/kg. P\textsubscript{PLAT} was recorded in 4,490/5,167 (86.9%) patients, from which C\textsubscript{RS} and DP were calculated, yielding means of 20.7 cmH\textsubscript{2}O, 40.5 ml/cmH\textsubscript{2}O, and 13.7 cmH\textsubscript{2}O, respectively. The median ventilator length of stay was five days (IQR: 4–9 days), and overall hospital mortality was 28.4% (95%CI: 27.1–29.6%). The distribution of TV/PBW received is shown in Fig 2.

Table 2 shows the model resulting from the first MLR analysis of the relationship between TV/PBW and hospital mortality. Age, APACHE predicted hospital mortality, PaO\textsubscript{2}/FiO\textsubscript{2}, and admission to two particular hospitals out of the 18 participating in the study were significantly associated with mortality, but TV/PBW taken as a continuous variable, was not.

Post-hoc MARS analysis confirmed a significant U-shaped relationship between TV/PBW and adjusted mortality, which was down-sloping (slope -0.17, p = 0.001) as TV/PBW increased from 4 to 7.1 ml/kg, and up-sloping (slope 0.20, P = 0.001) as TV/PBW increased above 7.1 ml/kg.
Table 3 shows the results of second MLR analysis, of the relationship between DP, TV/PBW and hospital mortality. DP was found to be significantly associated with mortality after adjustment for significant confounders with an OR\textsubscript{mort} of 1.10 (95% CI: 1.06–1.13; p = 0.009) for each one standard deviation (SD) increase in DP. Seven hundred twenty-six patients received DP one standard deviation or greater above the mean (≥19 cmH\textsubscript{2}O), with an OR\textsubscript{mort} of 1.15 (95% CI: 1.01–1.30), representing an estimated 33 deaths attributable to excessive DP. Age, APACHE predicted hospital mortality, PaO\textsubscript{2}/FiO\textsubscript{2}, and admission to two individual hospitals were also significant in this MLR model, which had Nagelkerke’s pseudo-R\textsuperscript{2} of 0.143.

Table 4 shows the results of third MLR analysis of the relationship between five strata of TV/PBW, DP and all significant confounders. Patients receiving 4–6 ml/kg were used as a referent for comparison with the other groups—ie. the OR for each of the other strata were compared to the 4–6 ml/kg strata. Patients receiving 6–7 ml/kg and 7–8 ml/kg had significantly lower adjusted OR\textsubscript{mort} (0.81 p = 0.05, and 0.78 p = 0.03 respectively. Patient’s receiving 8–10 ml/kg had adjusted OR\textsubscript{mort} of 0.80 with p = 0.06. The stratified analysis results from Table 4.
are illustrated in Fig 3. Since the adjusted OR_mort for TV 6–7, 7–8 and 8–10 ml/kg were all similar, we combined them together in post-hoc analysis, and using them as the referent group, the comparative adjusted OR_mort for patients receiving 4–6 ml/kg was 1.26 (95% CI: 1.04–1.52; p = 0.02).

**Discussion**

We report a large observational cohort study designed to examine the relationship between modifiable ventilator parameters and hospital mortality in hypoxic patients receiving mechanical ventilation. Our study cohort comprised about 25% of all patients receiving mechanical ventilation in our healthcare system, with a crude mortality of 28%, comparable to that of mild ARDS [17, 30]. Our patients were also similar to patients with ARDS in terms of age, PaO_2/FiO_2, Crs, TV and P_PLAT [9, 30]. A recent epidemiologic study suggests that more than 50% receiving mechanical ventilation with hypoxic respiratory failure, such as those included in our study, meet Berlin criteria for ARDS [30].

**Table 2.**

| Significant independent variables in the first MLR model: | Odds ratio* (95% CI) | P value |
|----------------------------------------------------------|----------------------|---------|
| Age                                                      | 1.16 (1.09–1.24)     | <0.001  |
| APACHE predicted mortality                               | 1.99 (1.86–2.14)     | <0.001  |
| PaO_2/FiO_2                                              | 0.87 (0.81–0.94)     | <0.001  |
| Admission to hospital X                                  | 1.64 (1.32–2.04)     | <0.001  |
| Admission to hospital Y                                  | 0.56 (0.36–0.86)     | 0.008   |

*Odds ratios are associated with a one standard deviation (SD) increment in the given variable, except in the case of admission to hospitals X or Y. Values used for SD: Age, 16.9 years; risk of death 26%; PaO_2/FiO_2, 70.
We adopted a pragmatic approach to patient selection, breaking with the convention of using ARDS as a selection criteria. ARDS is conceptually a clinical-pathological entity [16], but is currently diagnosed using imperfect clinical-radiological criteria [17] for which clinicians have demonstrated poor accuracy and low inter-rater reliability [18, 19]. Previous studies have shown that even researchers with expertise in ARDS have only moderate agreement when applying the clinical diagnosis of ARDS [20–22]. In contrast, the PaO\textsubscript{2}/FiO\textsubscript{2} ratio criteria we used to select our study patients was easy to accurately extract from the EMR and represents the only ARDS criteria independently associated with mortality [17]. This approach to patient selection makes our study unique in the context of related literature and eases translation of our results into population-based quality improvement.

In our first two multivariate analyses, we found that DP rather than TV/PBW was the modifiable ventilator parameter independently associated with survival. But our stratified analysis and multivariate adaptive regression splines analysis showed a significant U-shaped relationship between TV/PBW and adjusted mortality. Patient receiving 4–6 ml/kg had similar mortality to those receiving >10 ml/kg. But patients receiving 6–7, 7–8 and 8–10 ml/kg all had comparative adjusted OR\textsubscript{mort} about 0.80. These findings raise two provocative hypotheses. The current range of LTVV (4–8 ml/kg) might be composed of substrata with distinctly different mortality effects: TV in the range of 6-8ml/kg may be safer than 4–6 ml/kg. Intermediate tidal volume ventilation (ITVV) might not be inferior to LTVV. Disregarding previous convention, we might hypothesize the optimal TV/PBW range to be 6–10 ml/kg based on these observational findings. Using TV 6–10 ml/kg as the referent group, the comparative adjusted OR\textsubscript{mort} for patients receiving 4–6 ml/kg, such as targeted in the ARMA study, is 1.26 (95% CI: 1.04–1.52; p = 0.02).

A U-shaped relationship between TV/PBW and mortality was first posited by Eichacker and colleagues in their 2002 meta-analysis of ARDS trials testing LTVV [31], and was later described in a cohort of 5,183 mechanically ventilated patients that found that those receiving ≤6 ml/kg and those receiving >10 ml/kg had increased mortality (OR 1.23 and 1.14 respectively) compared to patients receiving 6–10 ml/kg (p = 0.09) [32]. A U-shaped relationship was not demonstrated in a much smaller cohort study (N = 485) that was not specifically powered to do so [33].

A U-shaped relationship between TV/PBW and mortality has sound physiological explanation [31]. Tidal volumes that are too high lead to alveolar overdistention, ventilator-induced lung injury, systemic inflammation, ventilator non-triggering, and eccentric respiratory muscle injury [1, 34–37]. Tidal volumes that are too low can cause hypercarbic acidosis, increased work of breathing, and patient-ventilator dyssynchrony [38–40]. The later can manifest as

| Significant independent variables in the second MLR model | Odds ratio\textsuperscript{*} (95% CI) | P value |
|----------------------------------------------------------|-------------------------------------|--------|
| Driving pressure                                         | 1.10 (1.06–1.13)                    | 0.009  |
| Age                                                      | 1.17 (1.09–1.26)                    | <0.001 |
| APACHE predicted mortality                               | 1.98 (1.90–2.05)                    | <0.001 |
| PaO\textsubscript{2}/FiO\textsubscript{2}                | 0.87 (0.80–0.94)                    | 0.002  |
| Admission to hospital X                                  | 1.74 (1.54–1.95)                    | <0.001 |
| Admission to hospital Y                                  | 0.53 (0.44–0.68)                    | 0.006  |

\textsuperscript{*}Odds ratios are associated with a one standard deviation (SD) increment in the given variable, except in the case of admission to hospitals X or Y. Values used for SD: Age, 16.9 years; risk of death 26%; PaO\textsubscript{2}/FiO\textsubscript{2}, 70; DP, 5.42 cmH\textsubscript{2}O.

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strenuous inspiratory efforts and double-triggering, either of which can paradoxically lead to alveolar overdistention [40–43]. Insufficient TV/PBW can also cause atelectrauma, increased respiratory rate (stress frequency) and increased sedation requirements [44]. The use of LTVV in the subset of ARDS patients with relatively preserved C\textsubscript{RS} has been shown to be associated with increased mortality [45].

Current evidence supporting LTVV has several important limitations. Clinical trials used to support LTVV [1, 3–8] did not perform comparative analysis of TV/PBW substrata comprising LTVV, and used tidal volumes (10–15 ml/kg PBW) in their control groups that were significantly higher than the intermediate tidal volumes commonly used in clinical practice at the time [31, 32, 46, 47]. Several authors have posited that the apparent benefit of LTVV in these trials might be solely attributable to the injuriously high tidal volumes and P\textsubscript{PLAT} received by control patients rather than to any specific benefit of LTVV [31, 48]. Deans and colleagues analyzed 2,587 patients who met enrollment criteria for the landmark ARMA trial [1], but

Table 4. Adjusted odds ratio for mortality in five strata of TV/PBW.

| Strata of TV/PBW (ml/kg) | 4–6 | 6–7 | 7–8 | 8–10 | >10 |
|--------------------------|-----|-----|-----|------|-----|
| N                        | 760 | 1672| 1554| 1026 | 155 |
| Median TV/PBW            | 5.8 | 6.5 | 7.5 | 8.6  | 11.0|
| Multivariate OR\textsubscript{mort}, mortality (95% CI) | 1.00* | 0.81 | 0.78 | 0.80 | 1.03 |
|                          | (0.65–1.00) | (0.63–0.97) | (0.63–1.01) | (0.67–1.59) |
| P-value from MLR (comparing adjusted OR\textsubscript{mort} to that of the 4–6 ml/kg) | 0.05** | 0.03** | 0.06 | 0.90 |

Abbreviations. TV/PBW: Tidal volume/predicted body weight, OR\textsubscript{mort}: Odds ratio for mortality, CI.: Confidence interval

*TV/PBW 4–6ml/kg is the referent group for the OR analysis.

** Patients receiving 6–7 and 7–8 ml/kg had significantly lower adjusted mortality than those receiving 4–6 ml/kg TV/PBW.

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were excluded for technical reasons such as lack of consent; these patients went on to receive conventional tidal volume management, yet achieved mortality of 31.7%—comparable to the 31.0% mortality of study patients that received LTVV and significantly lower than the 39.8% mortality experienced by study patients randomized to the control group [45]. In 2017, an international consensus of critical care societies published the results of a meta-analysis of nine randomized controlled trials comparing LTVV (4–8 ml/kg PBW) to “traditional” tidal volumes (10–15 ml/kg PBW) in patients with ARDS. They found no difference in mortality (risk ratio: 0.87–95% CI: 0.70–1.08) in their primary analysis [2] and provided no data comparing LTVV to ITVV, yet “strongly recommended” LTVV. Less than 5% of patients in a large epidemiological study of ARDS [9] and less than 3% of patients in our cohort received tidal volumes in the range >10 ml/kg used in the control groups of the studies included in this meta-analysis, so its relevance to current practice would be questionable even if its findings had been significant.

As early as 2002, Eichacker posited that ITVV (with limited P\textsubscript{PLAT}) was not inferior, and might be superior to LTVV, based on a patient data-level meta-analysis of ARDS clinical trials [31]. The only previous randomized controlled trial we are aware of that specifically compared LTVV to ITVV included 961 patients without ARDS, and showed no difference in mortality, ventilator days, length of stay, or pulmonary complications [29]. Although we cannot calculate the proportion of our cohort with ARDS, it is noteworthy that 20 years after the ARMA trial supporting LTVV 4-6ml/kg [1], only 14.7% of our patients received it, compared to the majority 82% receiving 6–10 ml/kg. Several previous reports similarly show that although most clinicians agree that LTVV should be used in patients with ARDS, only 7–19% of their ARDS patients receive it [49, 50]. An observational study including 459 ICUs in 50 countries showed that tidal volumes of 6–10 ml/kg were used in approximately 75% of ARDS patients, four times more often than 4-6ml/kg was used, and that clinical recognition of ARDS did not significantly influence the TV/PBW administered [9]. Our study supports this practical approach to ventilator management, even though it sometimes incorporates non-recommended ITVV. It is possible that clinicians are correctly choosing higher range LTVV and ITVV ventilation to avoid complications of strict 4–6 mg/kg LTVV.

Our observation that DP is related to mortality supports and extends the findings of a prior clinical trial meta-analysis [10], by showing that the relationship between DP and mortality holds in a heterogenous group of hypoxic patients, regardless of whether they have ARDS, even though clinical measurement of C\textsubscript{RS} by respiratory care practitioners in the presence of spontaneous inspiratory efforts could introduce significant error into the measurement or calculation of P_{\text{PLAT}}, C_{\text{RS}} and DP [14]. The later concern has previously been posited as an unresolved barrier to clinical implementation of DP-limited mechanical ventilation [42]. It is worth noting that DP equals TV/C_{\text{RS}}—therefore titration of DP can be seen as a form of precision medicine in which TV is matched to an individual patient’s respiratory system compliance.

Several studies provide context for our finding of a relationship between DP and mortality in hypoxic ventilated patients. A meta-analysis of clinical trials and observational studies [51] and three subsequent cohort studies [15, 30, 52] showed a significant relationship between DP and mortality in patients with ARDS. In patients without ARDS, a quasi-experimental trial [25], and two cohort studies [15, 24] showed that DP was associated with mortality. Of note, the latter study showed a significant relationship only in non-ARDS patients with PaO\textsubscript{2}/FiO\textsubscript{2} <300 mmHg. One recent observational study that did not require hypoxia as an inclusion criterion showed no relationship between DP and mortality in non-ARDS patients [52]. Reported threshold values for DP associated with increased mortality are in a relatively narrow range of 14–19 cmH\textsubscript{2}O [10, 30, 53], consistent with our results. Taken together, considerable data
support the contention that reducing DP < 19 cmH₂O would make a reasonable target to reduce mortality in mechanically ventilated patients.

Limitations
Residual bias/confounding remains a major threat to the validity of our observational study. The heterogeneity of our cohort and the real-world shortcomings of clinical data used in our study reduce internal validity, but increase the translational utility of our findings. Our exclusion of patients with less than three ventilator days could have introduced bias if such patients are especially prone to ventilator induced lung injury. We used only a single set of ventilator parameters per patient to describe ventilator management—a practical decision based on the large amount of clinical data we accessed. Our simplified calculation of C_RS did not take into account spontaneous patient effort. Elevated DP could be a marker of more severe underlying lung injury rather than a cause of increased mortality, notwithstanding our statistical adjustment for C_RS, PaO_2/FiO_2 and other confounders. We used APACHE IVa Ê predicted hospital mortality as an independent variable in our MLR, which has reduced discriminant accuracy in mechanically ventilated patients [54]. Although our MLR model was superior to APACHE IVa Ê, it had only a modest pseudo-R² for predicting mortality. We therefore suspect that lowering DP may have only a modest effect on mortality of mechanically ventilated patients, in whom myriad other factors likely influence survival. Prospective clinical trials are needed to further investigate whether ITVV is superior to strict LTVV, and to demonstrate clinical efficacy of DP-limiting ventilator strategies.

Conclusions
Driving pressures ≥19 cmH₂O were associated with increased adjusted hospital mortality in our retrospective cohort. We intend to use this finding to inform development of clinical decision support focused on limiting DP rather than achieving strict LTVV in our healthcare system. Tidal volumes of 4–6 ml/kg were used in less than 15% of patients and were associated with increased adjusted mortality. Tidal volumes of 6–10 ml/kg were used in 82% of patients and had significantly reduced adjusted mortality compared to that associated with tidal volumes 4–6 ml/kg. We hypothesize that ITVV may not be inferior to strict LTVV in patients with hypoxic respiratory failure.

Supporting information
S1 File.
(XLSX)

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References

1. The Acute Respiratory Distress Syndrome Network. Ventilation with lower tidal volumes as compared with traditional tidal volumes for acute lung injury and the acute respiratory distress syndrome. *N Engl J Med*. 2000; 342:1301–1308. https://doi.org/10.1056/NEJM200005043421801 PMID: 10793162

2. Fan E, Del Sorbo L, Goligher EC, Hodgson CL, et al. An official American Thoracic Society/European Society of Intensive Care Medicine/Society of Critical Care Medicine Clinical Practice Guideline: Mechanical ventilation in adult patients with acute respiratory distress syndrome. *Am J Respir Crit Care Med*. 2017; 195:1253–63. https://doi.org/10.1164/rccm.201703-0548ST PMID: 28459336

3. Amato MB, Barbas CS, Medeiros DM, Magaldi RB, Schettino GP, Lorenzi-Filho G, et al. Effect of a protective-ventilation strategy on mortality in the acute respiratory distress syndrome. *N Engl J Med*. 1998; 338:347–354. https://doi.org/10.1056/NEJM199802053380502 PMID: 9449727

4. Lee PC, Heismoor C, Cohn SM, Fink MP. Are low tidal volumes safe? *Chest*. 1990; 97:430–434. https://doi.org/10.1378/chest.97.2.430 PMID: 2288551

5. Determann RM, Royakkers A, Wolthuis EK, et al. Ventilation with lower tidal volumes as compared with conventional tidal volumes for patients without acute lung injury: a preventive randomized controlled trial. *Crit Care*. 2010; 14:R1–R17. https://doi.org/10.1186/cc8230 PMID: 20055989

6. Brochard L, Roudot-Thoraval F, Roupie E, Delclaux C et al. Tidal volume reduction for prevention of ventilator-induced lung injury in acute respiratory distress syndrome: the multicenter trial group on tidal volume reduction in ARDS. *Am J Respir Crit Care Med*. 1998; 158:1831–8. https://doi.org/10.1164/ajrccm.158.6.9801044 PMID: 9847275

7. Brower RG, Shanholtz CB, Fessler HE, Shade DM, et al. Prospective randomized controlled clinical trial comparing traditional versus reduced tidal volume ventilation in acute respiratory distress syndrome patients. *Crit Care Med*. 1999; 27:1492–9. https://doi.org/10.1097/00003246-199908000-00015 PMID: 10470755

8. Orme J, Romney JS, Hopkins RO, Pope D et al. Pulmonary function and health-related quality of life in survivors of acute respiratory distress syndrome. *Am J Respir Crit Care Med*. 2003; 167:690–4. https://doi.org/10.1164/ajrccm.167.5.200226-5420C PMID: 12493646

9. Bellani G, Laffey JG, Pham T, Fan E, Brochard L, for the LUNG SAFE Investigators; ESICM Trials Group. Epidemiology, patterns of care, and mortality for patients with acute respiratory distress syndrome.
syndrome in intensive care units in 50 countries. JAMA. 2016; 315:788–800. https://doi.org/10.1001/jama.2016.0291 PMID: 26903337

10. Amato MBP, Meade MO, Slutsky AS, Brochard L, et al. Driving pressure and survival in acute respiratory distress syndrome. N Engl J Med. 2015; 372:747–55. https://doi.org/10.1056/NEJmsa1410639 PMID: 25693014

11. Hubmayr RD. Point: Is low tidal volume mechanical ventilation preferred for all patients on ventilation? Yes. Chest. 2011; 140:9–10. https://doi.org/10.1378/chest.11-0825 PMID: 21729888

12. AHRQ Safety program for mechanically ventilated patients. https://www.ahrq.gov/hai/tools/mvp/index.html About. Accessed November 15, 2019.

13. Pham T, Brochard L, Slutsky AS. Mechanical ventilation: State of the art. Mayo Clin Proc. 2017; 92:1382–1400. https://doi.org/10.1016/j.mayocp.2017.05.004 PMID: 28870355

14. Barbas CSV, Palazzo RF. Should we titrate mechanical ventilation based on driving pressure—yes. Ann Transl Med. 2018; 6:393–7. https://doi.org/10.21037/atm.2018.06.26 PMID: 30460267

15. Sahetya SK, Mallow C, Sevransky JE, Martin GS, et al. Association between hospital mortality and inspiratory airway pressures in mechanically ventilated patients without acute respiratory distress syndrome: a prospective cohort study. Crit Care. 2019; 23:367–76. https://doi.org/10.1186/s13054-019-2635-y PMID: 31752980

16. Ashbaugh DG, Bigelow DB, Petty TL, Levine BE. Acute respiratory distress in adults. Lancet. 1967; 2:319–23. https://doi.org/10.1016/s0140-6736(67)90168-7 PMID: 4143721

17. Ranieri VM, Rubenfeld GD, Thompson BT, Ferguson ND et al; ARDS Definition Task Force. Acute respiratory distress syndrome: The Berlin definition. JAMA. 2012; 307:2526–33. https://doi.org/10.1001/jama.2012.5669 PMID: 22797452

18. Fountain S, Assar S, Heise C, Curry S, Raschke RA. What’s in a Chest Radiograph? Inter-rater variability in determining acute respiratory distress syndrome. Am J Resp Crit Care Med. 2018; 197:A5063.

19. Peng J-M, Qian C-Y, Yu X-Y, Zhao M-Y et al. Does training improve diagnostic accuracy and inter-rater agreement in applying the Berlin radiographic definition of acute respiratory distress syndrome? A multicenter prospective study. Crit Care. 2017; 21: https://doi.org/10.1186/s13054-015-0166-4 PMID: 28107822

20. Sjoding MW, Hofer TP, Co I, Courey A, et al. Interobserver reliability of the Berlin ARDS definition and strategies to improve the reliability of ARDS diagnosis. Chest. 2018; 153:361–7. https://doi.org/10.1016/j.chest.2017.11.037 PMID: 29248620

21. Sjoding MW, Cooke CR, Iwashyna T, Hofer TP. Acute respiratory distress syndrome measurement error: Potential effect on clinical study results. Ann Am Thorac Soc. 2016; 13:1123–8. https://doi.org/10.1513/AnnalsATS.201601-072OC PMID: 27159648

22. Shah CV, Lanken PN, Localio AR, Gallip R et al. An alternative method of acute lung injury classification for use in observational studies. Chest. 2010; 138:1054–61. https://doi.org/10.1378/chest.09-2997 PMID: 20576730

23. Neto AS, Cardoso SO, Manetta JA, Pereira VGM et al. Association between use of lung-protective ventilation with lower tidal volumes and clinical outcomes among patients without acute respiratory distress syndrome. JAMA. 2012; 308:1651–9. https://doi.org/10.1001/jama.2012.13730 PMID: 23093163

24. Schmidt MFS, Amaral ACKB, Fan E, et al. Driving pressure and hospital mortality in patients without ARDS: A Cohort study. Chest. 2018; 153:46–54. https://doi.org/10.1016/j.chest.2017.10.004 PMID: 29037528

25. Fuller BM, Page D, Stephens RJ, Roberts BW, et al. Pulmonary mechanics and mortality in mechanically ventilated patients without acute respiratory distress syndrome: A cohort study. Shock. 2018; 49:311–6. https://doi.org/10.1097/SHK.0000000000000977 PMID: 28846571

26. Assar S, Fountain S, Stoffer B, Ramos KS, Curry SC, Raschke RA. A clinical decision support system to enable precision delivery of evidence-based care to mechanically-ventilated patients. Am J Resp Crit Care Med. 2018; 197:A6823.

27. Olson K Shamsi-deen N, Fountain S, Raschke R. Clinical decision support system to locate mechanically-ventilated patients with high risk for mortality. Crit Care Medicine. 2019; 47:549.

28. Zimmerman JE1, Kramer AA, McNair DS, Malila FM. Acute Physiology and Chronic Health Evaluation (APACHE) IV: hospital mortality assessment for today’s critically ill patients. Crit Care Med. 2006 May; 34(5):1297–310. https://doi.org/10.1097/01.CCM.0000215112.84623.F0 PMID: 16540951

29. Writing group for the PREVENT investigators. Effect of low vs intermediate tidal volume strategy on ventilator-free days in intensive care unit patients without ARDS. JAMA. 2018; 320:1872–1880. https://doi.org/10.1001/jama.2018.14280 PMID: 30357256
30. Parhar KKS, Zjadewidz K, Soo A, Sutton A et al. Epidemiology, mechanical power, and 3-year outcomes in acute respiratory distress syndrome patients using standardized screening. *Ann Am Thorac Soc* 2019; 16:1263–72. https://doi.org/10.1513/AnnalsATS.201812-900OC PMID: 31247145

31. Eichacker PQ, Gerstenberger EP, Banks SM, Cui X and Natanson C. Meta-analysis of acute lung injury and acute respiratory distress syndrome trials testing low tidal volumes. *Am J Respir Crit Care Med.* 2002; 166:1510–4. https://doi.org/10.1164/rccm.200208-950OC PMID: 12406836

32. Esteban A, Anzueto A, Frutos F, et al. Characteristics and outcomes in adult patients receiving mechanical ventilation: a 28-day international study. *JAMA.* 2002; 287(3):345–355. https://doi.org/10.1001/jama.287.3.345 PMID: 11790214

33. Needham DM, Colantuoni E, Mendez-Tellez PA, Dinglas VD, et al. Lung protective mechanical ventilation and two year survival in patients with acute lung injury: prospective cohort study. *BMJ.* 2012; 344: e2124. https://doi.org/10.1136/bmj.e2124 (Published 5 April 2012) PMID: 22491953

34. Parker JC, Hernandez LA, Peevy KJ. Mechanisms of ventilator-associated lung injury. *Tremblay LN, Slutsky AS. Pathogenesis of ventilator-induced lung injury: Trials and tribulations.* 36.

35. Tremblay LN, Slutsky AS. Pathogenesis of ventilator-induced lung injury: Trials and tribulations. *Am J Physiol Lung Cell Mol Physiol.* 2005; 288:L596–598. https://doi.org/10.1152/ajplung.00438.2004 PMID: 15757952

36. Slutsky AS, Tremblay LN. Multiple system organ failure: Is mechanical ventilation a contributing factor? *Am J Resp Crit Care Med.* 1998; 157:1721–5. https://doi.org/10.1164/ajrccm.157.6.9709092 PMID: 9620897

37. Parthasarathy S, Jubran A, Tobin MJ. Cycling of inspiratory and expiratory muscle groups with the ventilator in airflow limitation [published correction appears in Am J Respir Crit Care Med 1999 Mar;159 (3):1023]. *Am J Respir Crit Care Med.* 1998; 158(5 Pt 1):1471–1478. https://doi.org/10.1164/ajrccm.158.5.9802014 PMID: 9817695

38. Feihl F, Perret C. Permissive hypercapnia: How permissive should we be? *Am J Respir Crit Care Med.* 1994; 150:1722–1737. https://doi.org/10.1164/ajrccm.150.6.7952641 PMID: 7952641

39. Kallet RH, Campbell AR, Dicker RA, Katz JA, Mackersie RC. Effects of tidal volume on work of breathing during lung protective ventilation in patients with acute lung injury and acute respiratory distress syndrome. *Crit Care Med.* 2006; 34:8–14. https://doi.org/10.1097/01.ccm.0000194538.32158.af PMID: 16374150

40. Gilstrap D, MacIntyre N. Patient-ventilator interactions: Implications for clinical management. *Am J Resp Crit Care Med.* 2013; 188:1058–68. https://doi.org/10.1164/rccm.201212-2214CI PMID: 24070493

41. Thille AW, Rodriguez P, Cabello B, Lellouche F, Brochard L. Patient-ventilator asynchrony during assisted mechanical ventilation. *Intensive Care Med.* 2006; 32:1515–22. https://doi.org/10.1007/s00134-006-0301-8 PMID: 16896854

42. Loring SH, Malhotra A. Driving pressure and respiratory mechanics in ARDS. *N Engl J Med.* 2015; 372:776–7. https://doi.org/10.1056/NEJMe1414218 PMID: 25693019

43. Beitler JR, Malhotra A, Thompson BT. Ventilator-induced lung injury. *Chest.* 2016; 148:376–385. https://doi.org/10.1016/j.chest.2016.07.004 PMID: 27842744

44.Gattinoni L. Counterpoint: Is low tidal volume mechanical ventilation preferred for all patients on ventilation? No. *Chest.* 2011; 140:11–13. https://doi.org/10.1378/chest.11-0827 PMID: 21729889

45. Deans KJ, Minneci PC. Mechanical ventilation in ARDS: One size does not fit all. *Crit Care Medicine.* 2005; 33:1141–2.

46. Thompson BT, Hayden D, Matthay MA, Brower R et al. Clinicians’ approaches to mechanical ventilation in acute lung injury and ARDS. *Chest.* 2001; 120:1622–7. https://doi.org/10.1378/chest.120.5.1622 PMID: 11713144

47. Carmichael LC, Dorinsky PM, Higgins SB, Bernard GR, et al. Diagnosis and treatment of acute respiratory distress syndrome in adults: An international survey. *J Crit Care.* 1996; 11:9–18. https://doi.org/10.1016/s0883-9441(96)90015-5 PMID: 8904279

48. Parshuram C, Kavanagh B. Meta-analysis of tidal volumes in ARDS. *Am J Respir Crit Care Med.* 2003; 167:798. https://doi.org/10.1164/rccm.167.5.950 PMID: 12598221

49. Weiss CH, Baker DW, Weiner S, Bechel M, Ragland M, Rademaker A, et al. Low Tidal Volume Ventilation Use in Acute Respiratory Distress Syndrome. *Crit Care Med.* 2016 Aug; 44(8):1515–22. https://doi.org/10.1097/CCM.0000000000001710 PMID: 27035237

50. Weiss CH, Baker DW, Tulas K, Weiner S, Bechel M, Rademaker A, et al. A Critical Care Clinician Survey Comparing Attitudes and Perceived Barriers to Low Tidal Volume Ventilation with Actual Practice. *Ann Am Thorac Soc.* 2017 Nov; 14(11):1682–1689. https://doi.org/10.1513/AnnalsATS.201612-973OC PMID: 28771042
51. Aoyama H, Pettenuzzo T, Aoyama K, Pinto R et al. Association of driving pressure with mortality among ventilated patients with acute respiratory distress syndrome: A systematic review and meta-analysis. *Crit Care Med.* 2018; 46:300–6. https://doi.org/10.1097/CCM.0000000000002838 PMID: 29135500

52. Lanspa MJ, Peltan ID, Jacobs JR, Sorensen JSet al. Driving pressure is not associated with mortality in mechanically ventilated patients without ARDS. *Crit Care.* 2019; 23:424–32. https://doi.org/10.1186/s13054-019-2698-9 PMID: 31881909

53. Villar J, Martin-Rodriguez C, Dominguez-Berrot AMet al. A Quantile analysis of plateau and driving pressures: Effects on mortality in patients with acute respiratory distress syndrome receiving lung-protective ventilation. *Crit Care Med.* 2017; 45:843–50. https://doi.org/10.1097/CCM.0000000000002330 PMID: 28252536

54. Raschke RA, Gerkin RD, Ramos KS, Fallon M, Curry SC. The explained variance and discriminant accuracy of APACHE IVa® severity scoring in specific subgroups of ICU patients. *Southwest J Pulm Crit Care.* 2018; 17:153–64.