Supplement

Oxygen administration during surgery and postoperative organ injury: observational

cohort study

Contents

- 1. Power analysis
- 2. Alternative measurements of excess oxygen exposure
- 3. Supplementary Table 1. Diagnostic codes for perioperative lung injury
- 4. Supplementary Table 2. Diagnostic codes for appendicitis and pancreatitis
- 5. Supplementary Table 3. Procedural codes for identifying type of surgery
- 6. Supplementary Table 4. Association between organ injury, mortality, and length of stay
- 7. Supplementary Table 5. Associations between oxygen exposure and secondary outcomes
- 8. Supplementary Table 6. Adjusted estimates of the rates of acute kidney injury (AKI), myocardial injury, and lung injury for patients receiving 80% and 30% FIO²
- 9. Supplementary Figure 1. Causal pathway diagram depicting potential framework of associations
- 10. Supplementary Figure 2. Independent associations between intraoperative oxygen exposure and organ injury in models that were adjusted for covariates included in primary models and duration of surgery.
- 11. Protocol and statistical analysis plan

1. Power analysis

In a cohort of patients submitted to MPOG from Vanderbilt University Medica Center the incidence of AKI, myocardial injury, and lung injury was 11.4%, 1.7% and 3.2% respectively. Assuming an incidence of organ injurie ranging between 1.5-11%, a sample of 300,000 patients would provide approximately 90% power to detect a 2-5% difference in odds of each of these outcomes, with type-1 error rate of 5%, when comparing patients stratified by the median AUCFIO2. This is based on unadjusted logistic regression with dichotomous exposure, a simplified but conservative version of the planned analysis.

2. Alternative measurements of excess oxygen exposure

The median (interquartile range) AUC_{FIO2} was 7,690 (5,631-10,814) %•minutes when minutes during which the $SpO₂$ was less than 96% were excluded from the calculation and 7,963 (5,880-11,124) %•minutes when minutes during which the $SpO₂$ was less than 90% were excluded from the calculation. When excess oxygen was redefined as the AUC of FIO₂ greater than 40%, the AUCFIO₂ was 3,971 (2,595-6,131) %•minutes.

3. **Supplementary Table 1.** Diagnostic codes for perioperative lung injury

The lung injury endpoint was defined in the study cohort according to the presence of any one or more of these International Classification of Diseases, Ninth Revision/Tenth Revision (ICD-9 or ICD-10) codes, derived from hospital discharge diagnoses and complications data, and as endorsed by international consensus guidelines .1,2 Selection of codes was based on the Agency for Healthcare Research and Quality (AHRQ) Patient Safety Indicator reports for postoperative respiratory failure and previously published large clinical studies that used registry data to study lung injury.^{3–7}

References

- 1. Abbott TEF, Fowler AJ, Pelosi P, et al. A systematic review and consensus definitions for standardised end-points in perioperative medicine: pulmonary complications. *Br J Anaesth*. 2018;120(5):1066-1079. doi:10.1016/j.bja.2018.02.007
- 2. Jammer I, Wickboldt N, Sander M, et al. Standards for definitions and use of outcome measures for clinical effectiveness research in perioperative medicine: European Perioperative Clinical Outcome (EPCO) definitions: a statement from the ESA-ESICM joint taskforce on perioperative outcome measures. *Eur J Anaesthesiol*. 2015;32(2):88-105. doi:10.1097/EJA.0000000000000118
- 3. Agency for Healthcare Research and Quality, U.S. Department of Health and Human Services (https://www.qualityindicators.ahrq.gov/). Patient Safety Indicator 11 (PSI 11) Postoperative Respiratory Failure Rate. AHRO $\overrightarrow{OT}^{\text{TM}}$ ICD-9-CM Specification Version 6.0: June 2017. Available at: https://qualityindicators.ahrq.gov/Downloads/Modules/PSI/V60- ICD09/TechSpecs/PSI_11_Postoperative_Respiratory_Failure_Rate.pdf. Accessed June 4, 2021.
- 4. Agency for Healthcare Research and Quality, U.S. Department of Health and Human Services (https://www.qualityindicators.ahrq.gov/). Patient Safety Indicator 11 (PSI 11) Postoperative Respiratory Failure Rate. AHRQ Quality Indicators[™] (AHRQ QI[™]) ICD-10-CM/PCS Specification v2018: June 2018. Available at: https://www.qualityindicators.ahrq.gov/Downloads/Modules/PSI/V2018/TechSpecs/PSI_11_Post operative_Respiratory_Failure_Rate.pdf. Accessed June 4, 2021.
- 5. Ladha K, Vidal Melo MF, McLean DJ, et al. Intraoperative protective mechanical ventilation and risk of postoperative respiratory complications: hospital based registry study. *BMJ*. 2015;351:h3646. doi:10.1136/bmj.h3646
- 6. Stocking JC, Utter GH, Drake C, et al. Postoperative respiratory failure: An update on the validity of the Agency for Healthcare Research and Quality Patient Safety Indicator 11 in an era of clinical documentation improvement programs. *Am J Surg*. 2020;220(1):222-228. doi:10.1016/j.amjsurg.2019.11.019
- 7. Kheterpal S, Vaughn MT, Dubovoy TZ, et al. Sugammadex versus Neostigmine for Reversal of Neuromuscular Blockade and Postoperative Pulmonary Complications (STRONGER): A Multicenter Matched Cohort Analysis. *Anesthesiology*. 2020;132(6):1371-1381. doi:10.1097/ALN.0000000000003256

4. **Supplementary Table 2.** Diagnostic codes for stroke, appendicitis, and pancreatitis

K85.8 Other acute pancreatitis
K85.80 Other acute pancreatitis K85.80 Other acute pancreatitis without necrosis or infection
K85.81 Other acute pancreatitis with uninfected necrosis K85.81 Other acute pancreatitis with uninfected necrosis
K85.82 Other acute pancreatitis with infected necrosis K85.82 Other acute pancreatitis with infected necrosis
K85.9 Acute pancreatitis, unspecified K85.9 Acute pancreatitis, unspecified
K85.90 Acute pancreatitis without necr Acute pancreatitis without necrosis or infection, unspecified K85.91 Acute pancreatitis with uninfected necrosis, unspecified
K85.92 Acute pancreatitis with infected necrosis, unspecified Acute pancreatitis with infected necrosis, unspecified

5. **Supplementary Table 3**. Procedural categorization coding using primary anesthesia current procedural terminology (CPT) codes

6. **Supplementary Table 4**. Association between acute kidney injury (AKI), myocardial injury, and lung injury with 30-day mortality and hospital length of stay (hLOS)

7. **Supplementary Table 5**. Associations between intraoperative oxygen exposure and secondary outcomes. Event rates (%) are reported for categorical outcomes and 50th ($25th$, $75th$) percentiles and number of eligible cases for length of stay (LOS). Estimates (95% confidence intervals) represent the odds ratio of stroke or mortality at 30 days or the difference in average hospital LOS between the 75th and the 25th percentiles of the intraoperative AUC_{FIO2} . P-values represent the statistical significance across the entire range of AUC_{FIO2} .

All analyses were adjusted for age, sex, BMI, ASA status, AHRQ Elixhauser comorbidity index, chronic pulmonary disease, emergency surgery, preoperative serum creatinine, hemoglobin, troponin and lactate concentrations, nitrous oxide exposure, median intraoperative PEEP, volumes of intraoperative intravenous crystalloid and packed red blood cells administrations, and intraoperative hypotension. SpO2, arterial hemoglobin oxygen saturation; FIO2, fraction of inspired oxygen; NA, not applicable.

8. **Supplementary Table 6**. Estimates of the rates of acute kidney injury, myocardial injury, and lung injury for patients receiving 30% and 80% FIO₂. Only 1% of cases received a median FIO₂ of 30% or less in this cohort, limiting accuracy of these estimates. Estimates were adjusted for all the covariates included in the primary analyses and duration of surgery.

9. **Supplementary Figure 1.** Causal pathway diagram depicting potential framework of associations

Causal pathway diagram. Arrows depict potential relationships between factors, and directionality shows the temporal relations between factors. Baseline (preopeartive) and intraoperative covariates were chosen for their potential to confound the measurement of the association between the primary exposure (AUC_{FIO2}) and postoperative organ injury outcomes (acute kidney injury, myocardial injury, lung injury, and other secondary endpoints). β captures the estimate of the association between the 75th and 25th percentile of AUC_{FIO2} and organ injury, adjusted for baseline and intraoperative covariates. A sensitivity analysis was conducted that excluded intraoperative covariates (potential colliders) since the primary α exposure could affect these factors. The impact of unmeasured potential confounders and unknown confounders is not accounted for in β , AUC $_{FIO2}$

10. **Supplementary Figure 2.** Independent associations between intraoperative oxygen exposure and organ injury in models that were adjusted for covariates included in primary models and duration of surgery. **A**. acute kidney injury (AKI), **B**. myocardial injury, and **C**. lung injury. Tick marks on the x-axis identify each decile of cases. P<0.001 for each organ injury.

11. **Protocol** (as posted on Open-Source Framework 8/23/2020, [osf.io/cfd2m\)](https://osf.io/cfd2m)

INTRODUCTION

Oxygen is one of the most widely used therapies during anesthesia, but the optimal $FIO₂$ during surgery remains unknown. High $FIO₂$ has been thought to offer many advantages, including an improved safety margin for airway manipulation, increasing perioperative arterial and wound tissue oxygen tension to enhance oxidative killing by neutrophils (1,2), improved healing of anastomotic sites (3,4), and decreased postoperative nausea and vomiting (5,6). Hyperoxia, however, has also been found to have a host of adverse effects, including promotion of absorption atelectasis (7), direct lung toxicity (8), increased airway inflammation (9), impaired regulation of blood glucose (10), and changes in cardiac index and peripheral vascular resistance (11-13). Clinical data on the effect of intraoperative $FIO₂$ has been equally conflicting. Initial data suggested that hyperoxia may play a role in decreasing surgical site infections (3,4), although recent clinical trials have failed to confirm this effect (14-17), and the existing studies have a high level of heterogeneity and risk for bias (18,19). Data from the ICU and cardiology literature suggest that hyperoxia may have a harmful effect on patient outcomes. The Oxygen-ICU trial demonstrated a significant increase in mortality when ICU patients were randomized to hyperoxic PaO₂ values up to 150 mm Hg, a level considered conservative by intraoperative standards (20). The AVOID study randomized ST elevation myocardial infarction patients to a supplemental oxygen group vs. air and found increased infarction size, recurrent MI, and arrhythmias in the oxygenation group (21). The PROXI trial, in a post-hoc analysis, reported an increase in perioperative myocardial infarction and long-term mortality in patients exposed to high $FIO₂$ while undergoing cancer surgery (22,23). A recent large registry study examined over 70,000 patients undergoing non-cardiothoracic surgery and found a dosedependent association between intraoperative $FIO₂$ and major respiratory complications, as well as 30-day mortality (24). The DETO2X-AMI trial, however, failed to demonstrate any differences in clinical outcomes between patients with acute myocardial infarctions provided 2 liters/minute nasal cannula oxygen vs. ambient air, despite significantly more hypoxemia events in the ambient air group (25). A best-practice strategy for administration of intraoperative $FIO₂$ remains unknown.

We will test the hypothesis that excess intraoperative oxygen administration is associated with postoperative kidney injury, myocardial injury, lung injury and secondary endpoints.

METHODS

Study design:

Multicenter observational cohort study

Study sites:

Multicenter Perioperative Outcomes Group (MPOG) participating medical centers

Study population:

The inclusion/exclusion criteria for the study are broad to capture a wide set of intraoperative oxygenation practices, a diverse patient population, and a patient population receiving a diverse set of surgical procedures. At the same time, we will exclude patients with known confounders (to limit indication bias).

Inclusion criteria:

- 18 years of age or older
- Duration of surgery of at least 120 minutes
- General anesthesia with tracheal intubation and mechanical ventilation
- Surgery from January 1, 2016 through November 22nd, 2018

Exclusion criteria:

- Pregnancy
- Outpatient surgery, defined according to surgical scheduling (i.e., patients who are scheduled outpatient but then are admitted to the hospital remain excluded)
- Airway surgery or bronchoscopy, documented using procedural codes
- One-lung or jet ventilation, documented by anesthesiologist
- Preoperative tracheal intubation
- Infrequent documentation of oxygenation during a case defined as any intraoperative periods of 5 minutes or more in which there are no $FIO₂$ or $SpO₂$ measurements or less than 60 intraoperative $FIO₂$ or $SpO₂$ measurements during the case.
- Intraoperative arterial hemoglobin desaturation $(SpO₂ < 90\%$ for more than three consecutive minutes), since these patients likely require a higher $FIO₂$ to maintain $SpO₂$ (i.e., high FIO₂ is needed to oxygenate Hb rather than excessive of that required to oxygenate Hb), and these patients likely have factors that will confound the association between higher $FIO₂$ and organ injury, factors that are independently associated with both need for increased FIO² and increased organ injury.
- Previous participation in the study within 90 days (i.e., repeat surgery)
- Renal replacement therapy (for the AKI outcome)
- No preoperative creatinine measurement (for the AKI outcome)
- Cardiac, pacemaker, defibrillator, cardiac ablation, or cardiac catheterization surgery (for the myocardial injury outcome)
- Preoperative myocardial injury, indicated by elevated preoperative troponin within 42 days prior to surgery (for the myocardial injury outcome)

Primary definition of oxygen exposure (independent variable):

We will measure intraoperative oxygen exposure using minute-to-minute $FIO₂$ and SpO² data. These data are part of current intraoperative vital sign data feeds into MPOG. FIO² data will be collected from intubation to extubation, or from intubation until out of room time for patients who are not extubated in the operating room. **Oxygen exposure will be quantified as the AUC of FIO² above 0.21 (air) during surgery for minutes when the corresponding SpO₂ is greater than 92%.** We will exclude the FIO₂ for minutes when the oxygen saturation is less than or equal to 92% in the area under the AUC calculation because we seek to quantify **excess oxygen delivery** as opposed to necessary oxygen delivery. We will also conduct a sensitivity analysis to further address potential confounding by indication, during which we will exclude cases in which patients have had any $SpO₂$ less than 96%, since anesthesiologists may increase $FIO₂$ following a decrease in $SpO₂$ and not subsequently decrease $FIO₂$ after $SpO₂$ increases.

For minutes when the $FIO₂$ is not available, we will assign the $FIO₂$ as the mean between the previous value and the subsequent value if the missing period is \langle five minutes. If there is no $FIO₂$ measurement for more than five minutes, the case will be excluded. Likewise, for minutes when the $SpO₂$ is not available, we will assign the $SpO₂$ as the mean between the previous value and the subsequent value if the missing period is \langle five minutes. If there is no $SpO₂$ measurement for more than five minutes, the case will be excluded.

Outcomes:

Primary endpoints of the study are three metrics of specific organ injury that may reflect oxygen toxicity or oxygen debt and include:

- Acute kidney injury (**AKI**), defined using the creatinine criteria of KDIGO consensus criteria (26). Stage I AKI is a 0.3 mg/dl creatinine increase within 48 hours of surgery or 50% increase within 7 days of surgery, stage II is a 100% increase within 7 days, and stage III is a 200% increase, increase to greater than 4.0 mg/dl, or initiation of dialysis within 7 days of surgery. The AKI endpoint will be defined as AKI as any of stage.
- Myocardial injury in patients undergoing non-cardiac surgery (**MINS**), defined as plasma concentrations of troponin I > 0.04 ng//ml within 72 hours of surgery(27).
- **Lung injury**, defined by the presence of International Classification of Diseases, Ninth Revision/Tenth Revision (ICD-9 or ICD-10) lung injury codes, derived from hospital discharge diagnoses and complications data, and as endorsed by international consensus guidelines (**Table 1**)(28,29). Selection of codes was based on previously published agency for healthcare research and quality (AHRQ) Patient Safety Indicator reports for postoperative respiratory failure and previously published clinical studies that used registry data to study postoperative lung injury (30-33).

Secondary endpoints include:

- 30-day mortality
- Length of stay, defined as the number of days from day of surgery to day of discharge including the day of surgery and the day of discharge

For those patients discharged from hospital prior to completion of the prespecified temporal window for definition of each individual organ injury (i.e. <7 days for AKI; <72 hours for MINS), we will assume they did not develop this organ injury following hospital discharge. We will collect additional patient characteristics to describe the cohort and covariates for adjusted analyses as described below.

Pre-operative variables collected will be age, sex, BMI, ASA physical status classification, past medical history including diagnosis of heart failure, diabetes, chronic pulmonary disease, and other medical conditions using the Elixhauser comorbidity list and baseline labs including hematocrit, creatinine, lactate, and troponin measured prior to surgery.

We will record the specific surgery for each patient, the surgery type, and whether the surgery was emergent.

Intraoperative data collected will include minute-to-minute $FIO₂$, minute-to-minute SpO2, minute-to-minute fraction of inspired nitrous oxide, duration of anesthesia, total fluid administration, total packed red blood cell transfusion, intraoperative hypotension, median intraoperative PEEP and TV per kg IBW. Definitions for these variables are outlined in **Table 2**. Postoperative data used to calculate organ injury include creatinine, troponin I, discharge and mortality data, and diagnosis codes.

Preliminary data to estimate Power and Sample Size:

To estimate power and sample size to complete this study and accomplish the Aims above, we queried the MPOG database and calculated numbers of existing eligible patients, assessed current intraoperative oxygenation practices, and estimated organ injury in a subset of MPOG centers. In these centers, we examined all cases from adult patients who received surgery from 1/1/2016 to 12/31/2017 with general anesthesia for at least one hour, were admitted to the hospital postoperatively, and had serum basic metabolic panel measured preoperatively and postoperatively. We excluded cases from patients who were pregnant or who underwent procedures on the trachea or bronchus. A total of 137,497 cases from 103,398 patients met these inclusion/exclusion criteria. These patients received the full spectrum of surgical procedures including neurologic, ENT, cardiac, trauma, orthopedic, burn, intraabdominal, urologic, gynecologic, and transplant surgery performed at these medical centers.

AKI affected 15,690 of these cases (11.4%). Specifically, KDIGO stage 1 AKI was diagnosed in 12,380 cases (9.0%), stage 2 AKI in 2386 (1.7%), and stage 3 in 924 cases (0.7%) .

Clinicians ordered a cardiac troponin I within 72 hours of surgery in 19,370 cases (14.1%) either to evaluate suspected myocardial injury/infarction or for surveillance purposes. In the subset of patients submitted from Vanderbilt University Medical Center in 2017 (N=19,169) the median (25th, 75th percentile) age was 56 years (42, 67), and 45.1% were female. The 10th, 25th 50th, 75th, and 90th administered FIO₂ was 0.50, 0.54, 0.58, 0.82, and 0.96, and the 10th, 25th 50th, 75th, and 90th SpO2 was 96%, 98%, 99%, 100%, and 100%. Myocardial injury (troponin $I > 0.04$ ng//ml within 72 hours of surgery) was diagnosed in 319 of the 19,169 patients (1.7%) in which it was measured. In addition, 140 (0.7%) died during hospitalization following surgery.

Lung injury was diagnosed in 3.2% of cases using AHRQ criteria.

If AKI, MINS, and lung injury affect between 11% and 1.5% of patients in the current study, with a two-sided test and type I error rate of 1%, 300,000 patients will provide approximately 90% power to detect a 5% to 12.5% difference in the odds of each of these organ injuries (AKI, MI, or lung injury), when comparing patients stratified by the median AUC of FIO² above 0.21 during surgery. This approximate power analysis is based on unadjusted logistic regression with dichotomous exposure, which is a simplified but conservative version of the planned analysis. The data in the planned study provide an excellent opportunity to measure the effect of intervention overall, but also affords the opportunity for robust analyses of heterogeneity of treatment effect in important subgroups (outlined in statistical analyses plan below).

Data Checking:

Quantile and tabular summaries will be computed for all analysis variables and reviewed by a clinical expert to assess for inconsistent or nonsensical values, and to evaluate the plausibility of extreme values. For each variable, we set validity criteria prior to statistical analysis (**Table 3)**. Values that do not meet the validity criteria will be considered missing.

Missing Data:

In computing the primary exposure variable (AUC of $FIO₂$ above 0.21 during surgery), missing $FIO₂$ data will be imputed or cases excluded as described in the "Definition of oxygen exposure" section above.

For each of the outcomes of interest, only centers who reported the outcome will be included in the analysis for that outcome. Within centers providing data for each outcome, we will assign patients without outcome data as not having the event as follows: patients without creatinine or myocardial enzyme data will be considered not to have suffered AKI or myocardial injury, respectively, based on the assumption that these labs were not measured because there was no indication for monitoring or clinical suspicion of AKI or myocardial injury. Similarly, when preoperative hemoglobin, creatinine, lactate, and troponin are treated as potential confounders, we will additionally condition on the indicator variable that takes value one when the lab is measured, and zero otherwise. Patients with missing length of stay will be excluded from analysis of that outcome.

As a sensitivity analysis (see Statistical Analyses section) we will exclude patients who lack outcome data from analysis of that outcome. This will reduce the number of patients in the cohort and bias the results to only those who have outcomes measured, but it will also restrict the analysis to a better phenotyped subgroup and reduce the effects of outcome misclassification. We will not assign any patient as having experienced an event unless there is documentation of that event.

Notwithstanding the methods described above, missingness in potential confounding variables, including perioperative laboratory measurements, will be addressed using multiple imputation. The chained equations method with predictive mean matching (PMM) will be used to generate five complete datasets. Statistical analyses will be implemented separately for each completed dataset and the results pooled using Rubin's rules.

Provider Practice Variation in FIO² Administration:

We anticipate that the observed variation in delivered $FIO₂$ may be explained in part by patient-level factors and also in part by physician-level factors. Some anesthesiologists may typically administer a higher or lower FIO2 than other anesthesiologists, independent of patient factors. Unlike variation in $FIO₂$ delivery that is driven by patient characteristics, variation in $FIO₂$ delivery by providers that is unrelated to patient characteristics may strengthen analysis of a causal pathway between excess FIO² and outcomes by providing opportunity to conduct an *instrumental variable analysis.* An instrumental variable analysis will mitigate the effect of indication bias and help assess the robustness of the findings of the primary analysis.

The instrumental variable analysis will leverage variation in provider practice while testing the hypothesis that intraoperative $FIO₂$ is associated with postoperative organ injury. The instrumental variable will be the provider's $FIO₂$ prescribing practice. We will calculate this variable by measuring the median $FIO₂$ for each case then calculate the median of these values across all the cases for each provider. Additional details of the instrumental variable analysis are provided in the following section.

Statistical Analyses:

We will use multivariable logistic regression for analysis of the primary endpoint where the independent variable of interest will be intraoperative hyperoxygenation, quantified as the area-under-the-curve (AUC) of $FIO₂$ above 0.21 for intraoperative minutes when the SpO₂ was >92%. The model will also adjust for *a priori* determined potential confounders of the association between intraoperative $FIO₂$ administration and postoperative organ injury. These potential confounders include age, sex, BMI, ASA status, AHRQ Elixhauser Comorbidity Index (34), chronic pulmonary disease, emergency surgery, preoperative hemoglobin concentration and its "ordered" indicator (as described in the Missing Data section), preoperative creatinine concentration and its "ordered" indicator, preoperative troponin concentration and its "ordered" indicator, preoperative lactate concentration and its "ordered" indicator, nitrous oxide exposure (quantified as the AUC for intraoperative fraction of inhaled nitrous oxide, measured in a similar manner as $FIO₂$), median intraoperative PEEP, intraoperative fluid and blood administration, and intraoperative hypotension (see Table 2). We will use indicator variables for the preoperative labs used as covariates including hemoglobin, creatinine, troponin, and lactate because many cases will not have one or more of these labs associated with it, and the decision to order one or more of the labs (indication for ordering) may be associated with intraoperative oxygen administration and outcomes. Even though there may be a significant degree of missingness for some of these labs, we do not want to exclude them as covariates because they could confound the relationship between oxygen exposure and organ injury.

The effects of quantitative covariates will be modeled using a flexible splines method. Quantitative and graphical regression diagnostics will be examined. In the event that the fully adjusted regression model is not estimable, or when there is other evidence of overfitting, the model complexity will be reduced by omitting terms (beginning with nonlinear terms), by categorizing or grouping variables, or by using a regularization technique (e.g., LASSO). Results for the primary endpoints will be presented as odds ratios comparing the 75th versus 25th percentile of the primary exposure variable, with 95% confidence intervals.

Pre-specified sensitivity analyses will include **1)** varying the metric of oxygen exposure, **2)** restricting the cohort for analysis based on data density and specific subgroups, and **3)** an instrumental variable (attending anesthesiologist) analysis:

- 1. Varying the metric of oxygen exposure. It is recognized that oxygen exposure may have been varied according to degrees of observed hypoxemia and other unidentified factors that may impact our outcomes of interest (confounding by indication). Moreover, it remains unknown if any toxicity associated with excess oxygen exposure is dependent on the partial pressure of oxygen within the alveolus $(PAO₂)$ or within the arterial circulation (PaO2) Therefore, in addition to our primary calculation of oxygen exposure as the AUC of FIO₂ above 0.21 (air) during surgery – excluding those minutes where $SpO₂ < 92%$, we will re-calculate oxygen exposure as:
	- AUC of FIO₂ above 0.21 (air) during surgery excluding those minutes where $SpO₂ < 96%$. The rationale for this is that an $SpO₂ < 96%$ likely reflects a PaO₂ that is also $\langle 100 \text{ mmHg}$, and clinicians may increase FIO₂ if SpO₂ $\langle 96\%$ even though the patient is not hypoxic. While variations in $FiO₂$ during these periods may reflect hyperoxia within the alveoli (PAO2) it is unlikely that hyperoxemia of the blood reaching other organs was simultaneously present. In contrast, a hyperoxic inspired gas in the presence of an observed $SpO₂ \square 96\%$ is consistent with true hyperoxemia of blood being delivered to other organs.
	- AUC of FIO₂ above 0.21 (air) during surgery excluding those minutes where SpO₂ <90%. The rationale for this is that an SpO₂ <90% likely reflects the oxygen content of arterial blood reaching the steep part of classical Hb-O² dissociation curve where further hemoglobin desaturation may significantly compromise tissue O_2 delivery, and because clinicians will most likely increase $FIO₂$ if the SpO₂ decreases below 90%. Increased $FIO₂$ in this context is not oxygenation in excess of that needed to maintain hemoglobin saturation, rather it is $FIO₂$ required to oxygenate hemoglobin. Increasing $FIO₂$ and oxygen delivery in this context may be considered non-modifiable due to the risk of end-organ hypoxia.
	- We will also explore the association between hyperoxia and organ injury under an alternative $FIO₂$ threshold of 0.4, measuring the AUC of $FIO₂$ above 0.4.
- 2. Restricting the cohort for analysis
	- We will exclude patients for each organ injury who died within the diagnostic window for that organ injury AND did not first develop the organ injury prior to death, to account for the potential competing risk of "early" death. Specifically, some patients may die prior to completion of the prespecified temporal window for the definition of each specific individual organ injury (i.e. <7 days for AKI; <72 hours for MINS; duration of hospitalization for ALI). By excluding these patients, the competing risk between "early" death and each organ-specific injury is eliminated, while retaining the full spectrum of severity of organ injury including organ injury that culminates in mortality. This analysis may produce a purer effect estimate of the association between hyperoxygenation and each organ-specific injury than what could be achieved with a composite of organ injury or death (another technique that addresses competing risk of early death).
- We will repeat the analysis for each outcome after excluding all patients in which that outcome is not measured to address the potential effect of ascertainment bias (as referenced in the Missing Data section).
- We will exclude all patients who had any oxygen desaturation during maintenance anesthesia, defined as any $SpO₂< 96%$ that occurred exclusive of induction (defined as the first 15 minutes of the case) and emergence (defined as the last 15 minutes of the case) of anesthesia. Although we have already excluded $FIO₂$ data when $SpO₂< 93\%$ from the calculation of "excess oxygen exposure" (reflecting that the higher $FIO₂$ may be clinically indicated during these periods), it is plausible that clinicians who increased $FIO₂$ in response to a desaturation may continue to administer an increased $FIO₂$ even after $SpO₂$ subsequently increases, potentially creating residual and unrecognized confounding by indication in patients who experienced even a brief intraoperative oxygen desaturation.
- We will conduct additional pre-specified subgroup analyses for the primary outcomes (AKI, MINS, and lung injury) according to age (patients separated into those <50 years old, those 50-70, and those >70), sex, diabetes, preoperative hemoglobin concentration (patients separated into those <10 g/dl, 10-12.5, and >12.5), procedure type (patients separated by surgery body region/type (see **Table 4**), and duration of surgery (patients separated into those whose surgery is 120- 180 minutes duration, 180-240, and greater than 240 minutes). The subgroup analysis according to duration of surgery will facilitate an exploration of the temporal component of any observed risk between cumulative hyperoxic exposure and adverse outcomes to better understand whether short-duration high-intensity hyperoxia should be considered an equivalent exposure to long-duration lowintensity hyperoxia. Subgroup analysis according to duration of surgery will also allow us to explore the potential confounding effect of surgery duration on the association between FIO² AUC and outcomes. We will examine if these factors modify any association between oxygen exposure and outcomes.
- 3. Anesthesiologist instrumental variable analysis
	- We will additionally implement the primary analysis using an instrumental variable method. The instrument will be the typical $FIO₂$ for each anesthesiologist (see FIO² Administration Practice Patterns and Provider Clustering section above). We will use the two-stage predictor substitution (2SPS) method. In the first stage we will regress the measured $FIO₂ AUC$ values onto the typical median $FIO₂$ values for each provider (i.e., the median $FIO₂$ across all cases for the provider of the median $FIO₂$ within each case, as described above). In the second stage, the predicted FIO² AUC from the first stage will be substituted for the measured FIO² AUC in the primary analysis.

Secondary endpoints will be evaluated using linear, logistic, proportional hazards, and cumulative logit regression methods as appropriate, but otherwise similar to the analysis of the primary endpoint.

Finally, to partially examine the clinical relevance of kidney injury, myocardial injury, and lung injury, we will evaluate the associations between these outcomes with 30 day mortality and hospital length of stay.

Limitations:

The major limitation of this study is the indication bias for intraoperative FIO2. We will attempt to control this limitation by eliminating FIO₂ data from the AUC calculation of oxygen exposure when the $SpO₂$ is < 92% (and by eliminating FIO₂ data from the AUC

calculation of oxygen exposure when the $SpO₂$ is < 90% or < 96% in sensitivity analyses), eliminating cases in which the SpO₂ is < 90% for three or more minutes, adjusting for confounders associated with $FIO₂$ and outcomes in our analyses, performing a sensitivity analysis in patients who never had any $SpO₂ < 96%$, and conducting an instrumental variable sensitivity analysis.

$ICD-9$	$ICD-10$	Diagnosis
518.51		Acute respiratory failure following trauma and surgery
518.52		Pulmonary insufficiency following trauma and surgery
518.81		Acute respiratory failure
518.84		Acute and chronic respiratory failure
	J80	Acute respiratory distress syndrome
	J95.1	Acute pulmonary insufficiency following thoracic surgery
	J95.2	Acute pulmonary insufficiency following non-thoracic surgery
	J95.821	Acute postprocedural respiratory failure
	J95.822	Acute and chronic postprocedural respiratory failure
	J96.00	Acute respiratory failure, unspecified whether with hypoxia or hypercapnia
	J96.01	Acute respiratory failure with hypoxia
	J96.02	Acute respiratory failure with hypercapnia
	J96.20	Acute and chronic respiratory failure, unspecified whether with hypoxia or
	J96.21	Acute and chronic respiratory failure, with hypoxia
	J96.22	Acute and chronic respiratory failure, with hypercapnia
	J96.90	Respiratory failure, unspecified, unspecified whether with hypoxia or hypercapnia
	J96.91	Respiratory failure, unspecified with hypoxia
	J96.92	Respiratory failure, unspecified with hypercapnia

Table 1. ICD-9/10 codes used to identify patients with lung injury

Variable	Definition	Description	
Duration of procedure	Total procedure time	Total minutes from in room to out of room	
Fluid administration	ml of crystalloid	Total ml of crystalloid fluids	
Blood transfusion	ml of packed red blood cells transfused	Total ml of packed red blood cells transfused	
Intraoperative hypotension	AUC of MAP $<$ 60 mmHg	AUC of MAP<60 mm Hg	
Measured Tidal Volume	TV in mL/kg/IBW	Median intraoperative TV in mL/kg/IBW	
PEEP- measured	Median intraoperative PEEP	Median intraoperative PEEP in cm of H_2O	
FIO ₂	Intraoperative fraction of inspired oxygen	Minute to minute $FIO2$ from intubation to extubation, or out of operative room for patients who remain intubated	
Oxygen Saturation $(SpO2)$	Intraoperative oxygen saturation	Minute to minute arterial hemoglobin oxygen saturation from intubation to extubation, or out of operative room for patients who remain intubated	
Nitrous Oxide administration	Amount of nitrous oxide used for duration of case	AUC of intraoperative nitrous use (% minutes)	

Table 2. Intraoperative characteristic definitions

Variable	Lower Threshold	Upper Threshold
Age (years)	18	125
BMI (kg/m^2)	14	80
Creatinine, baseline (mg/dl)	0.20	15.00
Hemoglobin, baseline (g/dl)	4.0	20.0
Hematocrit, baseline (%)	12.0	60.0
Total crystalloid equivalents (ml)		25000
pRBC, intraop (ml)	$\boldsymbol{0}$	30000
Length of stay (days)	1.00	500
Peep (cm H_2O)	0.00	30.00
Troponin, preop (ng/ml)	0.00	500
Lactate, preop (mmol/l)	0.00	30
Case duration (minutes)	120	1440
AHRQ Elixhauser Comorbidity Index	-32.00	99.00

Table 3. Lower and upper thresholds for continuous variables used in regression modeling. Values outside of these thresholds set to missing.

Category	Grouping
Head	Peripheral/Other
Neck	Peripheral/Other
Thoracic - Extrathoracic	Thoracic/Abdominal
Thoracic - Intrathoracic	Thoracic/Abdominal
Abdominal – Upper abdomen	Thoracic/Abdominal
Abdominal – Lower abdomen	Thoracic/Abdominal
Perineum	Peripheral/Other
Pelvis	Peripheral/Other
Upper and lower extremity	Peripheral/Other
Spine/Cord	Peripheral/Other
Other	Peripheral/Other

Table 4. Categories of procedures

References:

- 1. Babior, B. M. (1978) Oxygen-dependent microbial killing by phagocytes (first of two parts). *N Engl J Med* **298**, 659-668
- 2. Greif, R., Akca, O., Horn, E. P., Kurz, A., Sessler, D. I., and Outcomes Research, G. (2000) Supplemental perioperative oxygen to reduce the incidence of surgical-wound infection. *N Engl J Med* **342**, 161-167
- 3. Belda, F. J., Aguilera, L., Garcia de la Asuncion, J., Alberti, J., Vicente, R., Ferrandiz, L., Rodriguez, R., Company, R., Sessler, D. I., Aguilar, G., Botello, S. G., Orti, R., and Spanish Reduccion de la Tasa de Infeccion Quirurgica, G. (2005) Supplemental perioperative oxygen and the risk of surgical wound infection: a randomized controlled trial. *JAMA* **294**, 2035-2042
- 4. Garcia-Botello, S. A., Garcia-Granero, E., Lillo, R., Lopez-Mozos, F., Millan, M., and Lledo, S. (2006) Randomized clinical trial to evaluate the effects of perioperative supplemental oxygen administration on the colorectal anastomosis. *Br J Surg* **93**, 698-706
- 5. Greif, R., Laciny, S., Rapf, B., Hickle, R. S., and Sessler, D. I. (1999) Supplemental oxygen reduces the incidence of postoperative nausea and vomiting. *Anesthesiology* **91**, 1246-1252
- 6. Turan, A., Apfel, C. C., Kumpch, M., Danzeisen, O., Eberhart, L. H., Forst, H., Heringhaus, C., Isselhorst, C., Trenkler, S., Trick, M., Vedder, I., and Kerger, H. (2006) Does the efficacy of supplemental oxygen for the prevention of postoperative nausea and vomiting depend on the measured outcome, observational period or site of surgery? *Anaesthesia* **61**, 628-633
- 7. Carvalho, C. R., de Paula Pinto Schettino, G., Maranhao, B., and Bethlem, E. P. (1998) Hyperoxia and lung disease. *Curr Opin Pulm Med* **4**, 300-304
- 8. Kallet, R. H., and Matthay, M. A. (2013) Hyperoxic acute lung injury. *Respir Care* **58**, 123-141
- 9. Carpagnano, G. E., Kharitonov, S. A., Foschino-Barbaro, M. P., Resta, O., Gramiccioni, E., and Barnes, P. J. (2004) Supplementary oxygen in healthy subjects and those with COPD increases oxidative stress and airway inflammation. *Thorax* **59**, 1016-1019
- 10. Hals, I., Ohki, T., Singh, R., Ma, Z., Bjorklund, A., Balasuriya, C., Scholz, H., and Grill, V. (2017) Hyperoxia reduces insulin release and induces mitochondrial dysfunction with possible implications for hyperoxic treatment of neonates. *Physiol Rep* **5**
- 11. Harten, J. M., Anderson, K. J., Angerson, W. J., Booth, M. G., and Kinsella, J. (2003) The effect of normobaric hyperoxia on cardiac index in healthy awake volunteers. *Anaesthesia* **58**, 885-888
- 12. Anderson, K. J., Harten, J. M., Booth, M. G., and Kinsella, J. (2005) The cardiovascular effects of inspired oxygen fraction in anaesthetized patients. *Eur J Anaesthesiol* **22**, 420- 425
- 13. McNulty, P. H., Robertson, B. J., Tulli, M. A., Hess, J., Harach, L. A., Scott, S., and Sinoway, L. I. (2007) Effect of hyperoxia and vitamin C on coronary blood flow in patients with ischemic heart disease. *J Appl Physiol (1985)* **102**, 2040-2045
- 14. Meyhoff, C. S., Wetterslev, J., Jorgensen, L. N., Henneberg, S. W., Hogdall, C., Lundvall, L., Svendsen, P. E., Mollerup, H., Lunn, T. H., Simonsen, I., Martinsen, K. R., Pulawska, T., Bundgaard, L., Bugge, L., Hansen, E. G., Riber, C., Gocht-Jensen, P., Walker, L. R., Bendtsen, A., Johansson, G., Skovgaard, N., Helto, K., Poukinski, A., Korshin, A., Walli, A., Bulut, M., Carlsson, P. S., Rodt, S. A., Lundbech, L. B., Rask, H., Buch, N., Perdawid, S. K., Reza, J., Jensen, K. V., Carlsen, C. G., Jensen, F. S., Rasmussen, L. S., and Group, P. T. (2009) Effect of high perioperative oxygen fraction on surgical site infection and pulmonary complications after abdominal surgery: the PROXI randomized clinical trial. *JAMA* **302**, 1543-1550
- 15. Mayzler, O., Weksler, N., Domchik, S., Klein, M., Mizrahi, S., and Gurman, G. M. (2005) Does supplemental perioperative oxygen administration reduce the incidence of wound infection in elective colorectal surgery? *Minerva Anestesiol* **71**, 21-25
- 16. Pryor, K. O., Fahey, T. J., 3rd, Lien, C. A., and Goldstein, P. A. (2004) Surgical site infection and the routine use of perioperative hyperoxia in a general surgical population: a randomized controlled trial. *JAMA* **291**, 79-87
- 17. Gardella, C., Goltra, L. B., Laschansky, E., Drolette, L., Magaret, A., Chadwick, H. S., and Eschenbach, D. (2008) High-concentration supplemental perioperative oxygen to reduce the incidence of postcesarean surgical site infection: a randomized controlled trial. *Obstet Gynecol* **112**, 545-552
- 18. Allegranzi, B., Zayed, B., Bischoff, P., Kubilay, N. Z., de Jonge, S., de Vries, F., Gomes, S. M., Gans, S., Wallert, E. D., Wu, X., Abbas, M., Boermeester, M. A., Dellinger, E. P., Egger, M., Gastmeier, P., Guirao, X., Ren, J., Pittet, D., Solomkin, J. S., and Group, W. H. O. G. D. (2016) New WHO recommendations on intraoperative and postoperative measures for surgical site infection prevention: an evidence-based global perspective. *Lancet Infect Dis* **16**, e288-e303
- 19. Wetterslev, J., Meyhoff, C. S., Jorgensen, L. N., Gluud, C., Lindschou, J., and Rasmussen, L. S. (2015) The effects of high perioperative inspiratory oxygen fraction for adult surgical patients. *Cochrane Database Syst Rev*, CD008884
- 20. Girardis, M., Busani, S., Damiani, E., Donati, A., Rinaldi, L., Marudi, A., Morelli, A., Antonelli, M., and Singer, M. (2016) Effect of Conservative vs Conventional Oxygen Therapy on Mortality Among Patients in an Intensive Care Unit: The Oxygen-ICU Randomized Clinical Trial. *JAMA* **316**, 1583-1589
- 21. Stub, D., Smith, K., Bernard, S., Nehme, Z., Stephenson, M., Bray, J. E., Cameron, P., Barger, B., Ellims, A. H., Taylor, A. J., Meredith, I. T., Kaye, D. M., and Investigators, A. (2015) Air Versus Oxygen in ST-Segment-Elevation Myocardial Infarction. *Circulation* **131**, 2143-2150
- 22. Fonnes, S., Gogenur, I., Sondergaard, E. S., Siersma, V. D., Jorgensen, L. N., Wetterslev, J., and Meyhoff, C. S. (2016) Perioperative hyperoxia - Long-term impact on cardiovascular complications after abdominal surgery, a post hoc analysis of the PROXI trial. *Int J Cardiol* **215**, 238-243
- 23. Meyhoff, C. S., Jorgensen, L. N., Wetterslev, J., Siersma, V. D., Rasmussen, L. S., and Group, P. T. (2014) Risk of new or recurrent cancer after a high perioperative inspiratory oxygen fraction during abdominal surgery. *Br J Anaesth* **113 Suppl 1**, i74-i81
- 24. Staehr-Rye, A. K., Meyhoff, C. S., Scheffenbichler, F. T., Vidal Melo, M. F., Gatke, M. R., Walsh, J. L., Ladha, K. S., Grabitz, S. D., Nikolov, M. I., Kurth, T., Rasmussen, L. S., and Eikermann, M. (2017) High intraoperative inspiratory oxygen fraction and risk of major respiratory complications. *Br J Anaesth* **119**, 140-149
- 25. Hofmann, R., James, S. K., Jernberg, T., Lindahl, B., Erlinge, D., Witt, N., Arefalk, G., Frick, M., Alfredsson, J., Nilsson, L., Ravn-Fischer, A., Omerovic, E., Kellerth, T., Sparv, D., Ekelund, U., Linder, R., Ekstrom, M., Lauermann, J., Haaga, U., Pernow, J., Ostlund, O., Herlitz, J., Svensson, L., and Investigators, D. X. S. (2017) Oxygen Therapy in Suspected Acute Myocardial Infarction. *N Engl J Med* **377**, 1240-1249
- 26. Ad-hoc working group of, E., Fliser, D., Laville, M., Covic, A., Fouque, D., Vanholder, R., Juillard, L., and Van Biesen, W. (2012) A European Renal Best Practice (ERBP) position statement on the Kidney Disease Improving Global Outcomes (KDIGO) clinical practice guidelines on acute kidney injury: part 1: definitions, conservative management and contrast-induced nephropathy. *Nephrol Dial Transplant* **27**, 4263-4272
- 27. Keller, T., Zeller, T., Peetz, D., Tzikas, S., Roth, A., Czyz, E., Bickel, C., Baldus, S., Warnholtz, A., Frohlich, M., Sinning, C. R., Eleftheriadis, M. S., Wild, P. S., Schnabel,

R. B., Lubos, E., Jachmann, N., Genth-Zotz, S., Post, F., Nicaud, V., Tiret, L., Lackner, K. J., Munzel, T. F., and Blankenberg, S. (2009) Sensitive troponin I assay in early diagnosis of acute myocardial infarction. *N Engl J Med* **361**, 868-877

- 28. Abbott, T. E. F., Fowler, A. J., Pelosi, P., Gama de Abreu, M., Moller, A. M., Canet, J., Creagh-Brown, B., Mythen, M., Gin, T., Lalu, M. M., Futier, E., Grocott, M. P., Schultz, M. J., Pearse, R. M., and St, E. P. C. G. (2018) A systematic review and consensus definitions for standardised end-points in perioperative medicine: pulmonary complications. *Br J Anaesth* **120**, 1066-1079
- 29. Jammer, I., Wickboldt, N., Sander, M., Smith, A., Schultz, M. J., Pelosi, P., Leva, B., Rhodes, A., Hoeft, A., Walder, B., Chew, M. S., Pearse, R. M., European Society of, A., the European Society of Intensive Care, M., European Society of, A., and European Society of Intensive Care, M. (2015) Standards for definitions and use of outcome measures for clinical effectiveness research in perioperative medicine: European Perioperative Clinical Outcome (EPCO) definitions: a statement from the ESA-ESICM joint taskforce on perioperative outcome measures. *Eur J Anaesthesiol* **32**, 88-105
- 30. Ladha, K., Vidal Melo, M. F., McLean, D. J., Wanderer, J. P., Grabitz, S. D., Kurth, T., and Eikermann, M. (2015) Intraoperative protective mechanical ventilation and risk of postoperative respiratory complications: hospital based registry study. *BMJ* **351**, h3646
- 31. Kheterpal, S., Vaughn, M. T., Dubovoy, T. Z., Shah, N. J., Bash, L. D., Colquhoun, D. A., Shanks, A. M., Mathis, M. R., Soto, R. G., Bardia, A., Bartels, K., McCormick, P. J., Schonberger, R. B., and Saager, L. (2020) Sugammadex versus Neostigmine for Reversal of Neuromuscular Blockade and Postoperative Pulmonary Complications (STRONGER): A Multicenter Matched Cohort Analysis. *Anesthesiology* **132**, 1371-1381
- 32. Agency for Healthcare Research and Quality, U. S. D. o. H. a. H. S. (2017) Patient Safety Indicator 11 (PSI 11) Postoperative Respiratory Failure Rate. *www.qualityindicators.ahrq.gov*
- 33. Agency for Healthcare Research and Quality, U. S. D. o. H. a. H. S. (2018) Patient Safety Indicator 11 (PSI 11) Postoperative Respiratory Failure Rate. *www.qualityindicators.ahrq.gov*
- 34. Moore, B. J., White, S., Washington, R., Coenen, N., and Elixhauser, A. (2017) Identifying Increased Risk of Readmission and In-hospital Mortality Using Hospital Administrative Data: The AHRQ Elixhauser Comorbidity Index. *Med Care* **55**, 698-705