Supplemental Table 1. PRODIGY Trial Sites.

Region	Trial Site
	University of Colorado Hospital
	Emory University Hospital
	Brigham and Women's Hospital
	Beaumont Hospital
United	Buffalo General Medical Center
States	MetroHealth Medical Center
	Cleveland Clinic
	The Ohio State University Wexner Medical
	Center
	Providence Regional Medical Center
	Hôpital Foch (France)
	University Hospital Bonn (Germany)
Europe	Maastricht University Medical Center
Europe	(Netherlands)
	Hospital Clinico Universitario de Valencia
	(Spain)
	Okayama University Hospital (Japan)
Asia	Jikei University School of Medicine Hospital
Asia	(Japan)
	National University Hospital (Singapore)

Supplemental Table 2. Detailed PRODIGY Trial Inclusion and Exclusion Criteria.

Inclusion Criteria ^a	Exclusion Criteria
Patient was age ≥18, 20, or 21 years in	Patient whose hospital stay was expected to be
United States/Europe, Japan, and Singapore,	≤24 h
respectively	
Patient was able to give informed consent	Patient received intrathecal opioids
Receiving parenteral opioid therapy for	Post-surgical patient with American Society of
post-surgical or non-surgical pain on	Anesthesiologist (ASA) physical status V or
hospital general care floor	higher
	Patient with status of Do Not Resuscitate
	(DNR)
	Patient receiving hospice or end of life therapy
	Patient was ventilated or intubated
	Patient was unwilling or unable to comply with
	trial procedures
	Patient was a member of a vulnerable
	population (per ISO 14155)
	Patient participating in another potentially
	confounding drug or device clinical trial

^aPatients on oxygen and/or positive airway pressure were eligible for enrollment

Supplemental Table 3. Definitions of Clinical Episodes and Events.

Term	Definition
Respiratory Depression	Any of the following: respiratory rate ≤5 bpm
	for ≥ 3 minutes; SpO ₂ $\leq 85\%$ for ≥ 3 minutes;
	ETCO ₂ \leq 15 or \geq 60 mmHg for \geq 3 minutes;
	apnea episode lasting >30 seconds; or any
	respiratory opioid-related adverse drug event
Opioid-related adverse drug event	Any untoward medical occurrence,
	unintended disease or injury, or untoward
	clinical signs considered to be solely due to
	the use of opioid medication. Opioid-related
	adverse drug events were measured using
	standard of care bedside monitoring,
	including best clinical judgement of the
	bedside nurse/clinician.
	Any opioid-related adverse drug event
	involving impaired respiratory function.
	Respiratory opioid-related adverse drug
	events were measured using standard of care
	bedside monitoring, including best clinical
	judgement of the bedside nurse/clinician.
	Anticipated respiratory opioid-related adverse
	drug events included but were not limited to:
	Narcotic overdose that required opioid
	reversal
	Partial airway obstruction that required an
	NMBA antagonist
Respiratory opioid-related adverse drug event	Respiratory insufficiency that would
	require non-invasive positive pressure
	ventilation, ambu bag mask assisted
	ventilation
	Respiratory failure that would require
	invasive mechanical ventilation
	Upper airway obstruction requiring airway
	support measures (oral or nasal)
	Respiratory insufficiency or failure
	requiring transfer to the ICU
	Cardiopulmonary arrest
	Death due to respiratory or pulmonary
	related complications

Abbreviations: bpm = breaths per minute; SpO_2 = oxygen saturation; $ETCO_2$ = end-tidal carbon dioxide; NMBA = neuromuscular blocking agent; ICU = intensive care unit

Supplemental Table 4. Prioritization of Potential Respiratory Depression Episode Adjudication by the Clinical Event Committee, Based on the Clinical Importance of the Episode.

Priority Level	Definition
1	Any clinical event, independent of potential respiratory depression episode from continuous monitoring. If multiple clinical events occurred for 1 patient, events were adjudicated in chronological order.
2	Multiple episodes of ≥2 continuous monitoring parameters (SpO ₂ , ETCO ₂ , respiratory rate, apnea). If a patient had multiple Priority 2 instances, the data files with the highest number of potential episodes was reviewed first.
3	Multiple episodes of the same continuous monitoring parameter (SpO ₂ , ETCO ₂ , respiratory rate, apnea). If a patient had multiple Priority 3 instances, the data files were reviewed in order based on the type of episode: SpO ₂ , ETCO ₂ , respiratory rate, apnea.
4	Any overnight episodes of the same continuous monitoring parameter (SpO ₂ , ETCO ₂ , respiratory rate, apnea). If a patient had multiple Priority 4 instances, the data files were reviewed in order based on the type of episode: SpO ₂ , ETCO ₂ , respiratory rate, apnea.

For each patient, episodes of the earliest time occurrence were adjudicated first within each priority level. All clinical events were adjudicated, and all level 2, 3, and 4 priority episodes were adjudicated such that after the first confirmed respiratory depression episode was identified for each patient, subsequent potential respiratory depression episodes were not adjudicated. To ensure interrater reliability, at least 3 clinical event committee members separately reviewed each of the 5,768 potential respiratory depression episodes evaluated. All clinical event committee members were non-Medtronic, non-trial investigator clinicians with experience evaluating respiratory depression and interpreting continuous monitoring data. Final respiratory depression episode adjudication was determined by the majority agreement of individual clinical event committee members. Average 2 by 2 agreement, weighted for the number of adjudications, was 82% between clinical event committee members, suggesting strong agreement between these perioperative respiratory medicine experts. During adjudication, the clinical event committee had access to clinical data (including duration and time periods of opioid use) and CapnostreamTM 20p or 35 portable bedside monitor parameters but was blinded to all other patient information.

Abbreviations: $SpO_2 = oxygen$ saturation; $ETCO_2 = end$ -tidal carbon dioxide

Supplemental Table 5. Variables Included and Excluded in Univariable and Multivariable Analysis of Respiratory Depression.

N	Predictors	Reason for			
		Inclusion/Exclusion			
31	Age ^a , Sex, BMI ^a , Current Smoker ^a , Acute Bronchitis,	Included: Both bivariable and			
	Aortic Aneurysm, Aortic Valve Disease ^a , Asthma,	final model analysis ^b			
	Cerebral Aneurysm, Chronic Bronchitis, CHF ^a ,				
	COPD ^a , Coronary Artery Disease ^a , Diabetes Type I ^a ,				
	Diabetes Type II ^a , Hypertension, Kidney Failure ^a ,				
	Liver Failure ^a , Mitral Valve Disease ^a , Myocardial				
	Infarction ^a , Sleep Disorders ^a (known or suspected				
	sleep disorders, including OSA), Peripheral Vascular				
	Disease, Pulmonary Hypertension, Sepsis, Stroke,				
	Transient Ischemic Attack, Number of Different				
	Opioids, Opioid Naïve, High Risk Surgery ^a , Open				
	Surgery, Duration of Surgery				
1	Multiple opioid or concurrent central nervous system	Excluded: >90% prevalence			
	sedating medication ^a				
9	Chronic Restrictive Lung Disease, Cystic Fibrosis,	Excluded: <0.5% prevalence ^c			
	Emphysema, Multi Organ Dysfunction Syndrome ^a ,				
	Muscular Dystrophy, Orthostatic Hypotension,				
	Pulmonary Fibrosis, Sarcoidosis, Amyotrophic Lateral				
	Sclerosis				
3	ASA Physical Status, Neck Circumference,	Excluded: >25% correlation ^d			
	Pneumonia				
2	Surgical Patient, Intravenous and Epidural Opioid	Excluded: Other reasons ^e			
	Route ^a				

^aPredictor described in the literature as a risk factor for respiratory depression ¹⁻⁶

^eMedical patients were enrolled only in United States; opioid route and doses may be used in future ad hoc analysis

Abbreviations: ASA = American Society of Anesthesiologists; BMI = body mass index; CHF = chronic heart failure; COPD = chronic obstructive pulmonary disorder; OSA = Obstructive Sleep Apnea

bGeography and Effective length of monitoring quartiles were included as random effects. Covariables with very low prevalence (<0.5%) were excluded from the multivariable model. From the correlation analysis some covariables correlated with other covariables were excluded using statistical (correlation significant cut off >0.25) and clinical judgement. ASA score was excluded but several factors contributing to ASA score, such as BMI, CHF, and sleep disorders, were used in model derivation. Neck circumference was strongly correlated with BMI which is a standard clinical parameter. Thus, neck circumference was excluded. Pneumonia was excluded because it was strongly correlated with COPD, which is a reported risk factor for respiratory depression.

Online-Only References

- 1. Canet J, Sabate S, Mazo V, et al. Development and validation of a score to predict postoperative respiratory failure in a multicentre European cohort: A prospective, observational study. *Eur J Anaesthesiol*. 2015;32(7):458-470.
- 2. Felhofer K. Developing a Respiratory Depression Scorecard for Capnography Monitoring. *Inov Pharm.* 2013;4(3).
- 3. Jarzyna D, Jungquist CR, Pasero C, et al. American Society for Pain Management Nursing guidelines on monitoring for opioid-induced sedation and respiratory depression. *Pain Manag Nurs.* 2011;12(3):118-145 e110.
- 4. Kessler ER, Shah M, Gruschkus SK, Raju A. Cost and quality implications of opioid-based postsurgical pain control using administrative claims data from a large health system: opioid-related adverse events and their impact on clinical and economic outcomes. *Pharmacotherapy*. 2013;33(4):383-391.
- 5. Weingarten TN, Herasevich V, McGlinch MC, et al. Predictors of Delayed Postoperative Respiratory Depression Assessed from Naloxone Administration. *Anesth Analg.* 2015;121(2):422-429.
- 6. Safe use of opioids in hospitals. *Sentin Event Alert*. 2012(49):1-5.

Supplemental Table 6. Frequency of Variable Selection During Model Validation.

Variable	during bootstrapping (500 replicates)	Frequency of selection ^a during cross-validation (50 replicates)
Age classes (yr)	88.8%	96%
Sex (Male)	88.6%	96%
BMI (kg/m ²)	11.2%	0%
Current Smoker	8.2%	16%
Length of Surgery (h)	14.2%	8%
Opioid Naive	23.6%	34%
Number of Distinct Opioids	6.2%	2%
Cardiac Disorders		
Aortic Aneurysm	2.4%	0%
Aortic Valve Disease	2.8%	0%
Chronic Heart Failure	30.8%	46%
Coronary Artery Disease	3.8%	2%
Hypertension	41%	66%
Mitral Valve Disease	5.6%	8%
Myocardial Infarction	2%	0%
Pulmonary Hypertension	6.4%	8%
Hepatobiliary Disorders		
Liver Failure	3.2%	0%
Infections		
Sepsis	4.6%	0%
Metabolism and Nutrition Disorders		
Diabetes - Type I	7.2%	4%
Diabetes - Type II	4.2%	0%
Musculoskeletal and		
Connective Tissue Disorders		
Kidney Failure	12.8%	10%
Respiratory, Thoracic and Mediastinal Disorders		
Acute Bronchitis	12.2%	2%
Asthma	15%	12%
Chronic Bronchitis	3.2%	2%
Chronic Obstructive Pulmonary Disease	7.4%	2%
Sleep Disorders	37.4%	68%
Vascular Disorders		
Cerebral Aneurysm	7.6%	6%
Peripheral Vascular Disease	1.6%	0%
Stroke	1.8%	0%
Transient Ischemic Attack	11.6%	8%

^aThe multivariable logistic regression models used stepwise selection with entry 0.25, stay criteria 0.15, and respiratory depression as the dependent variable.

Supplemental Table 7. Adverse Events in the Modified Full Analysis Set (N=1,335).

Adverse Event	Total Patients (N = 1335)
Number of Adverse Event NE (NP, Y%)	367 (313,
	23.4%)
Cardiac disorders	8 (8, 0.6%)
Congenital, familial and genetic disorders	1 (1, 0.1%)
Ear and labyrinth disorders	2 (2, 0.1%)
Gastrointestinal disorders	26 (25, 1.9%)
General disorders	166 (163,
	12.2%)
Hepatobiliary disorders	2 (2, 0.1%)
Infections and infestations	48 (45, 3.4%)
Injury, poisoning, and procedural	22 (21, 1.6%)
complications	
Investigations	6 (6, 0.4%)
Metabolism and nutrition disorders	3 (3, 0.2%)
Musculoskeletal and connective tissue	4 (4, 0.3%)
disorders	
Neoplasms benign, malignant and unspecified	3 (3, 0.2%)
(incl. cysts and polyps)	
Nervous system disorders	9 (9, 0.7%)
Product issues	4 (4, 0.3%)
Psychiatric disorders	2 (2, 0.1%)
Renal and urinary disorders	4 (4, 0.3%)
Respiratory, thoracic, and mediastinal	47 (44, 3.3%)
disorders	
Skin and subcutaneous tissue disorders	5 (4, 0.3%)
Surgical and medical procedures	2 (2, 0.1%)
Vascular disorders	3 (3, 0.2%)

Vascular disorders 3 (3, 0.2%)

Adverse event: Any untoward medical occurrence, unintended disease or injury, or untoward clinical sign, observed by standard of care patient monitoring. All adverse events were recorded independent of their relationship to opioids or respiratory depression.

Abbreviations: NE= Number of events; NP = Number of patients

Supplemental Table 8. Opioid-related Adverse Events, Detection by Continuous Monitoring, and PRODIGY Scores for Patients with Opioid-related Adverse Events.

Twenty-two opioid-related adverse events occurred during the trial period, of which eleven occurred outside of continuous capnography and pulse oximetry monitoring. Adverse events occurring outside of continuous monitoring were excluded from model derivation.

]	PRODIGY Score	c
Type of Opioid- related Adverse Event	Opioid- related Adverse Events (N)	Adverse Events Detected by Continuous Monitoring ^{a,b}	High Risk (≥15 points) (N)	Intermediate Risk (≥8 & <15 points) (N)	Low Risk (<8 points) (N)
Hypoxia	13 (12)	6	9	1	2
Respiratory Failure	3 (3)	0	0	3	0
Bradypnea	1(1)	1	0	0	1
Hypotension	1(1)	1	0	1	0
Discomfort	2 (2)	1	0	1	0
Somnolence	1(1)	1	N/A	N/A	N/A
Abdominal Pain	1(1)	0	N/A	N/A	N/A
Sum	22 (18) ^c	$10^{a,b}$	9	6	3

^aFour adverse events (2 hypoxia, 1 respiratory failure, 1 discomfort) took place before capnography and pulse oximetry monitoring commenced

^bSeven adverse events (4 hypoxia, 2 respiratory failure, 1 abdominal pain) took place after capnography and pulse oximetry monitoring ended

^cFour patients each had 2 opioid-related adverse events; PRODIGY score was determined once per patient. One opioid-related adverse drug event (hypoxia) occurred during continuous monitoring but was not detected.

Supplemental Table 9. Adverse Event Incidence and Action Taken for Patients With and Without ≥ 1 Respiratory Depression Episode (Full Analysis Set = 1,495).

Endpoint	Any Adve	rse Event		e Event y Action	Adverse wit Hospital	th	Adverse with Su Proce	ırgical	Adverse with O Adminis	pioid	Adverse with Rescu	
Respiratory Depression Episodes	No Episodes	≥ 1 Episode	No Episode s	≥ 1 Episode	No Episodes	≥ 1 Episode	No Episodes	≥ 1 Episode	No Episodes	≥ 1 Episode	No Episodes	≥ 1 Episode
Patients (N)	840	655	840	655	840	655	840	655	840	655	840	655
Patients with Event (N)	212	139	79	84	49	47	24	21	72	68	16	29
Events (N)	237	175	85	100	51	53	26	22	83	81	17	33
Patients with Event (%)	25.2	21.2	9.4	12.8	5.8	7.2	2.9	3.2	8.6	10.4	1.9	4.4
Cumulative Exposure Time (Days) ^b	21387	17499	25133	19128	26074	20184	26395	20619	25115	19378	26544	20279
Rate (Pt/Day)	0.011	0.01	0.003	0.005	0.002	0.003	0.001	0.001	0.003	0.004	0.001	0.002
95% CI	0.010- 0.013	0.009- 0.012	0.003- 0.004	0.004- 0.006	0.001- 0.003	0.002- 0.003	0.001- 0.001	0.001- 0.002	0.003- 0.004	0.003- 0.005	0.000- 0.001	0.001- 0.002
Incidence Ratio	0.9	02	1.5	546	1.3	64	1.0	83	1.2	49	2.4	64
95% CI	0.686-	1.188	1.171	-2.041	1.014-	1.777	0.791-	1.483	0.931-	1.676	1.734-	3.501
Significance (p value)	0.4	64	0.0	002	0.0	40	0.6	18	0.1	38	<0.0	001

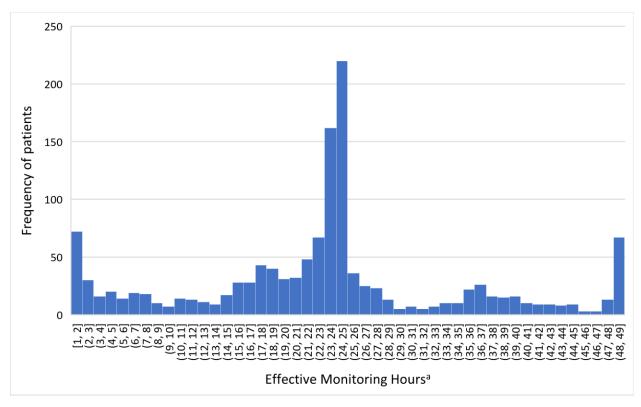
^aHospitalization defined as prolongation of initial hospital stay or re-hospitalization during ≤30 day follow-up

^bCumulative exposure time is the sum of the individual exposure time per patient.

Supplemental Table 10. Healthcare Resource Utilization, Including Hospital Length of Stay and ≤30 Day Readmission of Patients with and without Respiratory Depression.

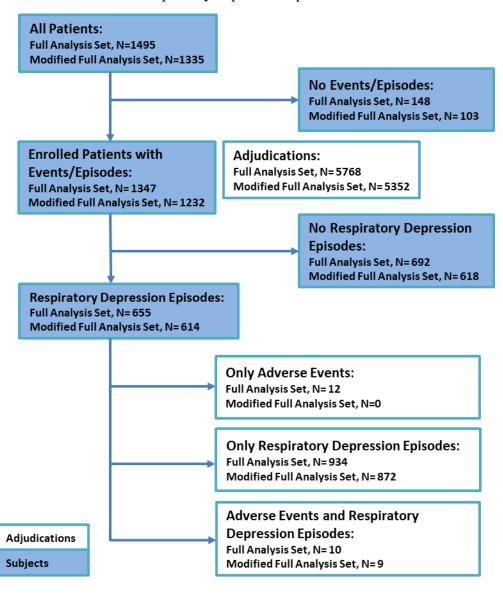
Patient Characteristic	Patients with ≥ 1 Respiratory Depression Episode	Patients without Respiratory Depression	Significance (p value)
Mean Length of Stay (N Days, SD) [N Patients]	10.5 (10.8) [614]	7.7 (7.8) [721]	<0.0001
Percent patients with ≤30 day readmission (N/Pts)	4.1% (23/556)	4.0% (24/597)	0.92
Primary Diagnosis at Readmission	Patients (N, %) with ≥ 1 Respiratory Depression Episode (N = 23)	Patients (N, %) without Respiratory Depression (N = 24)	
Blood and lymphatic system disorders	0 (0%)	1 (4.17%)	
Gastrointestinal disorders	5 (21.74%)	4 (16.67%)	
General disorders	2 (8.7%)	1 (4.17%)	
Infections and infestations	5 (21.74%)	5 (20.83%)	
Injury, poisoning and procedural complications	1 (4.35%)	2 (8.33%)	
Investigations	0 (0%)	1 (4.17%)	
Metabolism and nutrition disorders	1 (4.35%)	0 (0%)	
Musculoskeletal and connective tissue disorders	3 (13.04%)	1 (4.17%)	
Neoplasms benign, malignant and unspecified (incl cysts and polyps)	1 (4.35%)	0 (0%)	
Nervous system disorders	2 (8.7%)	0 (0%)	
Product issues	0 (0%)	1 (4.17%)	
Respiratory, thoracic and mediastinal disorders	1 (4.35%)	2 (8.33%)	
Surgical and medical procedures	2 (8.7%)	6 (25%)	
Vascular disorders	1 (4.35%)	1 (4.17%)	
Missing	1 (4.35%)	0 (0%)	

Supplemental Figure 1. Distribution of Effective Continuous Capnography and Pulse Oximetry Monitoring Time in Patients who Started Monitoring (N=1,335). Effective continuous monitoring was determined by subtracting any time in which the patient was temporarily disconnected from monitoring equipment from the total monitoring time (h).



^aThe extreme categories "1" and "49" contain data between 0.002 and 1 hour and data between 48 and 110.3 hours, respectively.

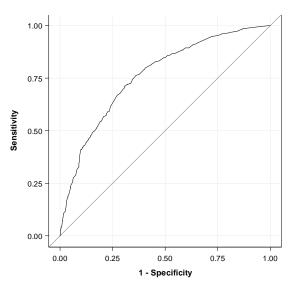
Supplemental Figure 2. Clinical Event Committee Adjudication Flow Diagram. The clinical event committee adjudicated potential respiratory depression episodes detected by continuous capnography and pulse oximetry in all enrolled patients. Differences between all enrolled patients (Full Analysis Set) and enrolled patients who received opioids and started monitoring (Modified Full Analysis Set) are highlighted for each adjudication step, including incidence of adverse events with and without respiratory depression episodes.

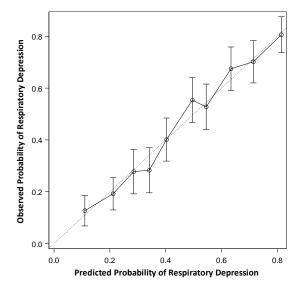


Supplemental Figure 3. Assessment of Multivariable Risk Prediction Model Accuracy. (A)

Receiver operating characteristic curve of multivariable risk prediction model, with an area under the curve equal to 0.7606. This represents the relationship between sensitivity and specificity and indicates the probability that the multivariable model will correctly distinguish patients with respiratory depression from those without respiratory depression. (B) Calibration plot of multivariable risk prediction model, comparing the predicted vs observed probability of respiratory depression, used to assess the prediction accuracy of the model. Patients were divided into deciles of the predicted probability of the fitted logistic model, and within each group, the mean predicted probability was calculated. Error bars represent 95% confidence intervals.







Supplemental Figure 4. PRODIGY Score Distribution (A) by Respiratory Depression Occurrence and (B) by Risk Score Class, including comparison of the expected probability of respiratory depression and the observed frequency of patients with respiratory depression.

