

ABCB1 genotype is associated with fentanyl requirements in critically ill children

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BACKGROUND: The gene *ABCB1* encodes p-glycoprotein, a xenobiotic efflux pump capable of transporting certain opioids, including fentanyl. *ABCB1* genotype has been previously associated with patient opioid requirements and may influence fentanyl dosing requirements in critically ill children.

METHODS: A diagnostically diverse cohort of 61 children who received a fentanyl infusion while admitted to the pediatric intensive care unit (PICU) were included in this study. We examined associations between fentanyl requirements, pain and sedation scores, serum fentanyl levels, and *ABCB1* genotype.

RESULTS: Patients with the AA allele at *ABCB1* locus rs1045642 received less fentanyl compared with patients with the AG or GG allele. A multivariable model demonstrated that patients with the AA allele received 18.6 mcg/kg/day less fentanyl than patients with either the AG or GG allele (95% confidence interval –33.4 to –3.8 mcg/kg/day; $P=0.014$). Incorporating race in this model demonstrated a similar association, but did not reach the threshold for multiple testing.

CONCLUSION: *ABCB1* genotype rs1045642 AA is associated with fentanyl administration in this cohort of children admitted to the PICU, likely because of decreased expression and activity of p-glycoprotein. Prospective evaluation of the influence of *ABCB1* in sedative–analgesia administration in critically ill children is warranted.

regarding optimal dosing strategies (3). Insufficient evidence exists to champion any single approach to administering sedation and analgesia in the PICU. A recent cluster-randomized, controlled trial conducted across 31 PICUs in the United States failed to demonstrate benefit measured in mechanical ventilation days among patients treated with a sedation protocol vs. those who received usual care (4).

The current standard of care for providing sedation and analgesia relies on an individualized clinical assessment of a patient's propensity for experiencing pain and psychological distress. Clinical circumstances such as the presence of mechanical ventilation, recent surgery, age, objective rating scales, and clinician intuition factor into the initiation of a sedative–analgesic regimen. Subsequent adjustments are made *post hoc* based on a patient's response, with restrictive dosing typically used to minimize iatrogenic dependence and subsequent withdrawal (5). Intrinsic to this reactive approach are episodes of inadequate pain control and inappropriate wakefulness that contribute to the adverse events and outcomes, such as prolonged mechanical ventilation, unplanned extubation, post-extubation airway edema, delirium, and post-traumatic stress disorder (3,6,7).

Clarification of individual patient characteristics including genotypes deterministic of sedative and analgesic requirements would improve the precision of drug administration during the care of seriously ill children and potentially reduce related adverse events. *ABCB1* codes for p-glycoprotein, a xenobiotic transporter present in multiple tissues, including the liver, intestines, kidney, and the blood–brain barrier (BBB) (8). As such, it is known to be a key determinant of systemic drug exposure and central nervous system disposition for several medications, including some opioids (9). Single-nucleotide polymorphisms (SNPs) in *ABCB1* have been associated with peri-procedural opioid requirements, although the influence of *ABCB1* genotype on sedative–analgesia requirements in seriously and critically ill children has not been examined (10–13). Accordingly, we undertook a retrospective analysis of a cohort of diagnostically diverse

Invasive life support strategies and interventions in the intensive care unit are frequently painful and psychologically distressing (1,2). The use of opioid medications is ubiquitous in pediatric intensive care units (PICU) for ensuring patient safety and mitigating the psychological impact of critical illness. A number of approaches have been described to guide titration of opioids; however, considerable variation exists among both practitioners and centers

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patients admitted to a quaternary PICU to determine associations between fentanyl requirements and genotypes for SNPs in the *ABCB1* gene.

RESULTS

Demographics and Clinical Characteristics

Of the 61 patients in the study cohort, primary admission diagnoses were categorized as neurologic for 19 (31.1%), respiratory for 13 (21.3%), gastrointestinal/transplant for 8 (13.1%), other for 8 (13.1%), sepsis for 7 (11.5%), and post-operative for 6 (9.8%). **Table 1** displays demographics and clinical characteristics of the cohort, including stratification by race. Black patients were younger than white patients in this cohort. Of the entire cohort of 104 patients, those who received a fentanyl infusion were younger, more likely to be female, and more likely to require tracheal intubation, mechanical ventilation, a vasopressor infusion, or a muscle relaxant infusion compared with patients who did not receive a fentanyl infusion (**Supplementary Table S1** online).

Allele Frequencies

Table 2 displays the frequencies of the individual alleles at each tested loci with the respective disequilibrium coefficients. All SNPs were in Hardy–Weinberg equilibrium. Minor alleles at rs2229109 were of low frequency in this cohort, with only one patient with a minor allele receiving a fentanyl infusion, precluding further analysis of this genotype. There were no significant differences in allele frequencies between the population of patients receiving fentanyl and the population reported in the 1000 genome project, or our previous study of adults with traumatic brain injury (TBI) hospitalized in this catchment area (**Supplementary Tables S2 and S3**) (14,15).

ABCB1 and Fentanyl Exposure

Fentanyl exposure in the cohort ranged from an aggregate of 13.8 to 142.8 µg/kg/day. Univariable regression demonstrated a significant association between the rs1045642 genotype and fentanyl exposure, with less fentanyl administered to the AA vs. AG/GG genotypes (**Table 3**). The average fentanyl exposure for the AA group was 49.4 ± 24.6 vs. 66.5 ± 30 µg/kg/day (*P* = 0.041) for the AG/GG genotypes. There was no significant difference between the rs1045642 AA and AG/GG genotypes with regard to median duration of fentanyl infusion (**Table 4**).

Clinical Covariates, rs1045642, and Fentanyl Exposure

Regression analysis examining clinical covariates and fentanyl exposure are shown in **Table 5**. No significant association was observed for patients also receiving infusions of dexmedetomidine, morphine, and/or midazolam. Only one patient in the cohort who received fentanyl also received a hydromorphone infusion. Patients who received infusions of either cisatracurium or vecuronium received significantly more fentanyl, as did patients who had tracheal intubation and those who required mechanical ventilation. No significant association was observed between fentanyl exposure and BMI, age,

Table 1. Clinical characteristics

	Fentanyl infusion	Race ^a	
	N = 61	White n = 53	Black n = 6
Age (mo) (median (IQR))	72 (19–132)	84 (18–144)	30 (24–108)
BMI (mean ± s.d.)	20.4 ± 7.3	20.2 ± 7	23.1 ± 9.5
Female, n (%)	30 (49.2)	27 (50.9)	3 (50)
Tracheal intubation	55 (90.2)	47 (88.7)	6 (100)
Mechanical ventilation	57 (93.4)	49 (92.5)	6 (100)
Muscle relaxant infusion	28 (45.9)	25 (47.2)	2 (33.3)
Surgery	34 (55.7)	30 (56.6)	3 (50)
Tracheostomy dependence	7 (11.5)	7 (13.2)	0 (0)
Vasopressor infusion	26 (42.6)	24 (45.3)	2 (33.3)

BMI, Body Mass Index; mo, months.

^aRace undocumented for two patients.

gender, vasopressor infusion, PICU length of stay (LOS), or surgery during admission. After adjusting for the presence of a neuromuscular blocker infusion (cisatracurium or vecuronium), intubation, and mechanical ventilation, rs1045642 and neuromuscular blocker infusion remained significantly associated with fentanyl exposure (**Table 6**). A multivariable model incorporating race and 59 patients who received fentanyl (excluding 2 of unknown race) also demonstrated a nominal association between rs1045642 and fentanyl exposure, but did not reach the Benjamini–Yekutieli threshold for significance. Race remained significantly associated with fentanyl exposure after adjustment. Variance inflation factors for all variables in the multivariable models were < 1, indicating low multi-collinearity.

SNPs, Fentanyl Levels, and Patient Comfort

Blood samples obtained at least 12 h following initiation of a fentanyl infusion were available for 44 patients. Regression analysis did not reveal any significant associations between fentanyl blood levels and rs1045642 or rs1128503 genotype. Median fentanyl levels for the rs1045642 genotypes AA and AG/GG were 3.3 (interquartile range (IQR) 2–5.7) and 3 (IQR 2.1–5) ng/ml (*P* = 0.958), respectively. There was no association between rs1045642 genotype and either average sedation score or average Face, Legs, Activity, Cry, Consolability (FLACC) score. **Figure 1** displays the relationship between fentanyl exposure, fentanyl levels, average sedation score, and average FLACC score according to rs1045642 genotype. Among patients who received neuromuscular blockade, there was no significant difference in average FLACC score between those with the AA and AG/GG genotypes.

DISCUSSION

Continuous sedative–analgesic infusions are commonly necessary to facilitate invasive life support strategies during critical illness and in the perioperative period. Fentanyl is the

Table 2. ABCB1 allele details

	SNP			Allele	Frequency	P (HWE)	D'
	Alias	Function	Location				
rs1045642	C3435T	Synonymous	87138645	A	0.490	0.232	0.0299
				G	0.510		
rs1128503	C1236T	Synonymous	87179601	A	0.405	0.561	-0.0140
				G	0.595		
rs2229109	G1692A	Missense	87179809	C	0.975	0.799	-0.0006
				T	0.025		

Table 3. Univariable analysis of association between ABCB1 alleles and fentanyl exposure

SNP (n)	Allele	n	β (μg/kg/day) (95% CI)	P ^a
rs1045642 (61)	AA	17	-17.1 (-35.5--0.7)	0.041
	AG	25		
	GG	19	2.3 (-14.1-18.7)	0.782
	Add G		6.7 (-3.1-16.4)	0.177
rs1128503 (61)	AA	11	-6.6 (-26.3-13.1)	0.503
	AG	26		
	GG	24	2.7 (-12.9-18.2)	0.730
	Add G		3.1 (-7.4-13.5)	0.558
rs2229109 (60)	CC	59	—	
	TC	1		

^aUnivariable linear regression.

Table 4. Characteristics of patients according to rs1045462 genotype

	rs1045462		P ^a
	AA n = 17	AG/GG n = 44	
Fentanyl exposure (μg/kg/day) ^b	49.4 ± 24.6	66.5 ± 30	0.041
Fentanyl infusion duration (days) ^c	2.7 (1.7-6.2)	4.4 (1.7-10.5)	0.326
PICU LOS (days) ^c	7.99 (5.5-14.9)	9.9 (6.6-16.1)	0.385
Age (mo) ^c	60 (18.8-132)	72 (36-168)	0.596
Female, n (%)	9 (52.9%)	21 (47.7%)	0.715
BMI ^b	20.6 ± 9	20.4 ± 6.7	0.898
Average sedation score ^b	1.6 ± 0.8	1.5 ± 0.6	0.585
Average FLACC score ^b	0.6 ± 0.5	0.6 ± 0.5	0.946
Black race, n (%)	0 (0)	6 (13.6)	0.115

BMI, Body Mass Index; FLACC, Face Legs Activity Cry Consolability; IQR, interquartile range; LOS, length of stay; mo, month; PICU, pediatric intensive care unit; SD, standard deviation.

^aMann-Whitney for medians, Student's t test for averages.

^bMean ± SD

^cMedian (IQR).

preferred medicine for this purpose at our institution and many other centers (16). Fentanyl's potency and potential for dose-related toxicities mandate careful titration, yet

Table 5. Univariable analysis of clinical covariates

Covariate	n	β (μg/kg/day) (95% CI)	P ^a
Age	61	-0.1 (-0.2-0.1)	0.379
Any neuromuscular blocker	28	21.4 (7.2-35.6)	0.004
Black race ^b	6	35.4 (11.4-59.5)	0.005
Dexmedetomidine	20	6.8 (-9.3-22.9)	0.399
Tracheal intubation	55	30.1 (5.8-54.4)	0.016
Female	30	-4.1 (-19.3-11.1)	0.591
Mechanical ventilation	57	31.3 (1.7-60.9)	0.039
Midazolam	16	3.9 (-13.4-21.2)	0.652
Morphine	6	-1.3 (-26.9-24.2)	0.917
PICU LOS	61	0.2 (-0.02-0.5)	0.07
Surgery	34	0.9 (-14.4-16.2)	0.905
Tracheostomy dependence	7	-18.8 (-42.2-4.5)	0.112
Vasopressor infusion	26	-3.1 (-18.4-12.3)	0.690

PICU, pediatric intensive care unit.

^aUnivariable linear regression.

^bFifty-nine patients included, two patients of unknown race excluded.

anticipating a patient's response frequently involves heuristic risk stratification. This same estimative approach also typically guides the decision to add in or substitute other sedative-analgesic medications.

Foreknowledge of an individual patient's response to sedative-analgesics would promote greater precision in optimizing sedation. Such an individualized approach relies on predicting dose-response relationships of commonly used medications such as fentanyl through an understanding of pharmacokinetics and pharmacodynamics. Each patient's metabolic profile, opioid receptor structure and expression, drug transporter structure and expression, and clinical circumstances should be appreciated. Recognizing pharmacogenomic factors that predict drug response across a range of clinical scenarios represents an initial step in this regard. We identified one ABCB1 SNP, rs1045642 genotype AA, that is associated with reduced fentanyl requirements in a diagnostically diverse sample of PICU patients, but other genes related to opioid metabolism, transport, and elimination including cytochrome P450 family proteins, mu-opioid

Table 6. Multivariable regression model

Covariate	β ($\mu\text{g}/\text{kg}/\text{day}$) (95% CI)	P^a	β ($\mu\text{g}/\text{kg}/\text{day}$) ^a (95% CI)	P^a
rs1045642 (AA)	- 18.6 (-33.4- - 3.8)	0.014	- 15 (-29.8- - 0.2)	0.047
Any neuromuscular Blocker	21.4 (8.1-34.8)	0.002	22.8 (9.8-35.8)	0.001
Tracheal intubation	22.4 (-14.8-59.5)	0.232	19.2 (-16.2-54.7)	0.281
Mechanical ventilation	5.4 (-39.3-50.2)	0.808	4.2 (-38.4-46.8)	0.844
Black race ^b	—	—	31.6 (9.9-53.3)	0.005

^aMultivariable linear regression.

^bFifty-nine patients included, two patients of unknown race excluded.

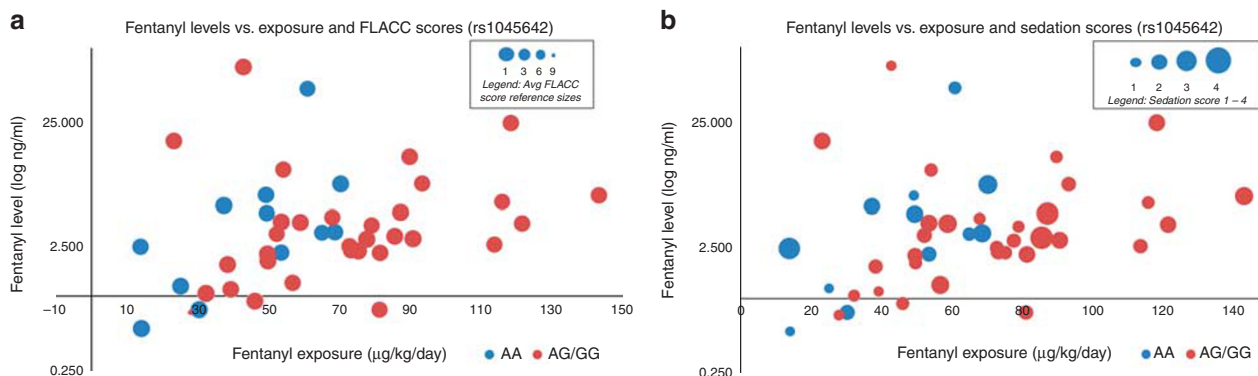


Figure 1. The relationship between fentanyl level (log ng/ml), fentanyl exposure (mcg/kg/day), average face, Legs, Activity, Cry, Consolability (FLACC) score (a), and average sedation score (b) for each patient in the cohort.

receptor, and rhomboid family members, among others, warrant evaluation in future studies.

As a xenobiotic efflux transporter with multiple substrates, p-glycoprotein (the protein product of *ABCB1*) has been associated with opioid requirements in several clinical settings. Inhibition of p-glycoprotein with quinidine has been shown to potentiate the effects the opioid loperamide. When administered together to a small study cohort of eight subjects, quinidine and loperamide resulted in a significant degree of respiratory depression compared with control patients who received loperamide and placebo (17). In mice with variable levels of brain *ABCB1* expression, those mice with lower expression had more pronounced responses to morphine (18). Prospective evaluation of morphine requirements in 263 children undergoing tonsillectomy revealed an additive effect of a minor allele (G) at *ABCB1* locus rs9282564 that was associated with increased post-operative respiratory depression (13). Examination of rs1045642 did not reveal any association with either post-operative respiratory depression or post-operative morphine requirements in this tonsillectomy cohort. Two other prospective studies evaluating the influence of *ABCB1* SNPs controlled for ethnicity in their inclusion criteria. In a study of 126 Koreans who underwent spinal anesthesia with fentanyl, patients with rs1045642 genotype AA and rs2032582 genotype AA experienced a significant decrease in respiratory rate within minutes of fentanyl administration compared with other genotypes (12).

A similar study of 83 Turkish patients undergoing spinal anesthesia with a single dose of intravenous fentanyl did not demonstrate relationships between *ABCB1* SNPs (including rs1045462) and respiratory depression (10). The authors did point out a nonsignificant downtrend in respiratory rate in patients with rs1045642 genotype AA.

Individuals with rs1045462 genotype AA have lower levels of *ABCB1* expression in duodenal tissue (19). A comparable reduction in expression in the liver, kidney, and the BBB would provide a mechanistic basis for the reduced fentanyl requirements in patients with the AA genotype. P-glycoprotein is present in the canalicular membrane of bile duct cells, the tubular membrane of the proximal renal tubule, and in the endothelium of the BBB. Reduced expression of p-glycoprotein may result in decreased excretion of substrate opioids from the brain into plasma and decreased excretion from plasma into bile and urine. Despite receiving different amounts of fentanyl, plasma levels and the FLACC pain scores among patients with the rs1045642 AA genotype were similar relative to the remaining cohort. This may be expected as fentanyl is dosed to effect (sedation/pain scores); it suggests that patients with rs1045642 genotype AA require lower fentanyl doses to achieve desired clinical effect and equivalent plasma levels.

rs1045462 was independently associated with fentanyl exposure controlling for covariates associated with fentanyl requirements in this cohort. In determining fentanyl

exposure, the duration of fentanyl infusion was accounted for by calculating the total dose administered ($\mu\text{g}/\text{kg}$) by the duration over which it was given (days); however, children in the PICU are known to develop tolerance to opioids over time that is typically matched with escalating doses until the patient is ready to wean (20). Importantly, there was no difference in the duration of fentanyl infusion in relation to rs1045462 genotype. Race was also significantly associated with fentanyl exposure in both univariable and multivariable analyses, with White patients receiving less fentanyl per day compared with Black patients. This finding is compatible with previous reports of African-American patients exhibiting lower pain tolerance compared with Caucasians, although the genetic determinants of this differential response remain to be clarified (21).

This study is limited by its retrospective design. As this study made use of a convenience sample and was not sufficiently powered to clarify the relationship between race and fentanyl exposure, conclusions regarding this association must be curbed, although they warrant further investigation in a larger population. More robust population pharmacokinetic modeling using detailed pharmacokinetic sampling from a larger cohort is planned to validate the relationship observed between genotype and fentanyl exposure in the present cohort (22). Although the present study represents the largest pharmacogenomic evaluation of *ABCBI* in critically ill children to date, the relatively small sample size raises the possibility that the findings were driven by a few outliers; however, as **Figure 1** displays, fentanyl exposure, fentanyl levels, sedation scores, and FLACC scores were generally well distributed across the cohort.

Patients in this cohort represent a diverse range of diagnoses, including patients with acute and chronic brain injury. Sufficient diagnostic information was not available in the de-identified data set to account for the influence of baseline impaired consciousness on sedative requirements. Prospective assessment adjusting for impaired consciousness as a reason for reduced sedative requirements is necessary to determine whether the baseline mental status is confounding the apparent association between rs1045642 genotype and fentanyl requirements in this cohort. Similarly, the hypothesized role of p-glycoprotein in relation to the BBB indicates a need to further study the influence of rs1045642 genotype in diseases that result in compromise to the cerebral vasculature, such as cerebral vasculitis and TBI. The diagnostic heterogeneity of this modestly sized cohort prevented analysis for associations between specific disease and genotype, or fentanyl exposure, as each diagnostic category contained a relatively heterogeneous set of pathologies. The gastrointestinal category, e.g., contained patients who underwent solid organ transplant, as well as patients with intussusception. Our study targeted patients expected to have a PICU LOS of at least 3 days, with 60% receiving fentanyl infusion. Patients receiving fentanyl infusions are generally sicker than patients who do not require a continuous sedative–analgesic medication during hospitalization. Therefore, it is not clear whether

our findings are generalizable to PICU patients receiving only bolus fentanyl administration, infusions for short durations, and/or with shorter expected PICU LOS. Similarly, the use of neuromuscular blockade in this cohort may be an indication of illness severity. Patients receiving neuromuscular blockade received more fentanyl, although it is unclear whether this finding is related to the patient response or instead reflects extra vigilance on the part of clinicians to ensure adequate sedation in the absence of a reliable physical exam. Controlling for both diagnosis and illness severity will be essential in larger, prospective sedation–analgesia pharmacogenomic studies in PICU patients.

The current approach to sedation in the PICU is imprecise, can lead to major adverse events such as unplanned extubation, and contributes to untoward outcomes such as prolonged mechanical ventilation (23,24). A clearer understanding of the molecular traits that determine response to sedative–analgesic medicines will provide the basis for individualized regimens for children in the PICU and could have implications for patients of all ages. In the emerging era of precision medicine, genomic-based patient stratification of sedative–analgesic response could provide a novel framework for clinical trials designed with the aim of improving our ability to conscientiously administer opioids. Our findings, alongside existing evidence to date, suggest that a larger, prospective assessment of pharmacogenomics-based approaches to sedation and analgesia in the PICU is warranted.

METHODS

Study Design and Setting

A retrospective cohort study was undertaken involving 61 diagnostically diverse patients admitted to the PICU at our quaternary children's hospital who received a fentanyl infusion. Approval was granted by the University of Pittsburgh Institutional Review Board.

Participants and Data Collection

Serum samples and DNA were prospectively collected as part of a cohort study of 104 randomly enrolled PICU patients with inclusion criteria that included only predicted PICU LOS ≥ 3 days, presence of an indwelling central venous or arterial line for blood sampling, and informed consent from the parent or legal guardian, and were otherwise unrestricted. Of these 104 patients, 61 received a fentanyl infusion and were therefore included in this study. Blood was obtained from the indwelling catheter, and serum samples and blood pellets were stored at -80°C . DNA was extracted using the Qiaamp DNA extraction kit (Qiagen, Valencia, CA).

Relevant demographics and clinical characteristics were extracted from an electronic health record database by our organization's data warehouse and de-identified for this study. The primary admission diagnosis for each patient was categorized as neurologic, respiratory, sepsis, gastrointestinal/transplant, post-operative, or other. Record review of sedative requirements noted patients who received an opioid infusion (fentanyl, morphine, or hydromorphone), midazolam infusion, dexmedetomidine infusion, or neuromuscular blocker infusion (cisatracurium or vecuronium). Clinical parameters of interest included whether the patient had tracheal intubation, had received mechanical ventilation while in the PICU, had undergone surgery during the hospitalization, or had received a vasopressor infusion while in the PICU.

Genotyping

The TaqMan allelic discrimination assay was used to analyze genotypes using a candidate gene approach. Three SNPs involving the *ABCB1* transporter gene were selected on the basis of both previously reported and hypothesized associations with opioid requirements: rs1045642 (C3435T), rs1128503 (C1236T), and rs2229109 (G1692A) (10–13). Allele frequencies in this cohort were compared with population distributions reported in the 1000 genome project (14).

Medication Dosing and Clinical Outcome Metrics

The main outcome of interest was opioid responsiveness according to genotype as determined by fentanyl dose requirements during PICU admission. Fentanyl was the most common sedative–analgesic medication administered to the cohort. Total fentanyl exposure was calculated for patients who received a fentanyl infusion for at least 6 h while in the PICU. Sedative–analgesic dose titration and infusion initiation practices in the study center PICU vary by clinical circumstances and ordering clinician (either physician or nurse practitioner), with some patients receiving several boluses of fentanyl before initiation of an infusion. Fentanyl exposure was therefore calculated as a sum of all fentanyl administered to the patient while receiving an infusion, inclusive of all boluses delivered concomitant with the infusion. Boluses were also included if administered within 12 h before the start of the infusion or for as long as the bolus administration frequency equaled or exceeded 1 bolus per hour. This approach was taken to maximize inclusion of administered fentanyl that was directed toward ongoing sedation–analgesia efforts while excluding sporadic, isolated doses such as a single bolus given for brief procedural or operative sedation–analgesia.

Other metrics for opioid responsiveness included the FLACC Scale score and the University of Michigan Sedation Scale score. Both of these metrics are recorded hourly for all patients on continuous sedative infusions in the study center's PICU. The FLACC scale ranges from 0 to 10, with higher scores indicating more pain (25). The Michigan Sedation scale ranges from 0 to 4, with higher scores indicating deeper sedation (26). Averages for each score were calculated by multiplying each scale's scores by the proportion of measurements attributed to that score for each patient. Other sedative–analgesic infusions, neuromuscular blocker infusions, and methadone prescriptions were recorded if they were administered or prescribed during the patient's hospital stay.

Fentanyl Levels

Fentanyl levels were measured in samples obtained from patients who had received at least 12 h of preceding fentanyl infusion, to optimize the likelihood that a relative steady state had been achieved. Plasma fentanyl concentrations were determined by ultra-high-performance tandem mass spectrometry (UPLC-MS/MS). Sample preparation of 100 μ l of plasma involved protein precipitation with 2% phosphoric acid, addition of d5-fentanyl (Cerilliant, Round Rock, TX) as an internal standard, solid-phase extraction using Oasis MCX cation-exchange columns (Waters, Milford, MA), and sample reconstitution in 90% 0.15% formic acid/10% acetonitrile. Separation of 7.5 μ l of the injected sample was achieved via reverse-phase UPLC using a BEH C18 1.7 μ m, 2.1 \times 100 mm column (Acquity, Waters, Milford, MA). Mobile phase consisted of 0.15% formic acid (solution A) and acetonitrile (solution B) to provide a 0.2 ml/min gradient elution as follows: initially 90% A/10% B for 1 min, then linearly increasing to 100% B over 3 min and holding for 1 min before finally returning to initial conditions over 0.5 min, and holding for 2 min to achieve a total run time of 7.5 min. Mass spectrometric detection of fentanyl was performed using a TSQ Quantum Ultra triple quadrupole mass spectrometer (Thermo, Waltham, MA) operated in positive electrospray ionization mode with optimized instrument parameters. Calibration curves were linear from 0.125 to 200 ng/ml ($r^2 = 0.999$) with a variation of <14.8%.

Statistical Analysis

Hardy–Weinberg equilibrium was tested for the individual SNPs. The χ^2 test was used to examine dichotomous outcomes. The binomial probability test was used to compare cohort allele frequency with population allele frequency. The Mann–Whitney test and Student's *t* test were used to compare nonparametric and parametric continuous variables, respectively. Univariable and multivariable linear regression was used to identify associations between SNPs and fentanyl exposure and levels. Biallelic loci were coded in both additive and dichotomized models. Bivariate univariable regression analysis was used to examine associations between fentanyl exposure and the clinical characteristics of alternative sedative infusions, mechanical ventilation, tracheal intubation, any surgical intervention during the hospital stay, administration of vasopressors, gender, and race. Age and body mass index were tested as continuous variables. Multivariable linear regression models were constructed incorporating independent variables that demonstrated a statistically significant association with fentanyl exposure in univariable analysis ($P < 0.05$). Models were limited to a maximum of five independent variables, to allow at least 10 to 15 degrees of freedom for each variable. It was expected that the cohort would be relatively racially homogeneous based on experience with the demographics of the study center. Accordingly, we questioned whether this cohort was sufficiently diverse to adequately distinguish whether race was a significant predictor of fentanyl exposure. Two multivariable models differing only in the inclusion/exclusion of race as an independent variable were constructed in recognition of the relatively small sample size and racial homogeneity of the cohort. To account for multiple testing across three SNPs, alpha was set at 0.027 according to the Benjamini–Yekutieli method (27,28). Multi-collinearity was evaluated by examining variance inflation factors for the multivariable model. Analysis was performed using Stata 14.0 (StatCorp, College Station, TX).

SUPPLEMENTARY MATERIAL

Supplementary material is linked to the online version of the paper at <http://www.nature.com/pr>

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