# Nurse staffing levels and patient outcomes: A systematic review of longitudinal studies 

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#### Abstract

Background: The contribution of registered nurses towards safe patient care has been demonstrated in many studies. However, most of the evidence linking staffing levels to outcomes is cross-sectional with intrinsic limitations including an inability to establish that presumed cause (staffing) precedes the effect. No reviews have summarised longitudinal studies considering nurse staffing and patient outcomes. Objectives: To identify and assess the evidence for an association between nurse staffing levels, including the composition of the nursing team, and patient outcomes in acute care settings from longitudinal studies. Methods: We undertook a systematic review of studies where the association between nurse staffing with patient outcomes was assessed in a longitudinal design. Studies with repeated cross-sectional analyses were excluded unless a difference-in-difference design was used. We searched Medline, CINAHL, Embase and the Cochrane Library up to February 2022. We used the ROBINS-I tool to assess risk of bias. We synthesised results in a tabular form and a narrative grouped by outcome. Results: 27 papers were included. Studies were conducted in a variety of settings and populations, including adult general medical/surgical wards and adult and neonatal intensive care units. Staffing measures were operationalised in a variety of different ways, making direct comparisons between studies difficult and pooled estimates impossible. Most studies were either at serious $(\mathrm{n}=12)$ or critical $(\mathrm{n}=5)$ risk of bias, with only 3 studies at low risk of bias. Studies with the most risk of bias were judged as likely to underestimate the effect of higher registered nurse staffing. Findings are consistent with an overall picture of a beneficial effect from higher registered nurse staffing on preventing patient death. The evidence is less clear for other patient outcomes with a higher risk of bias, but in general the proposition that higher registered nurse staffing is likely to lead to better patient outcomes is supported. Evidence about the contribution of other nursing staff groups is unclear. Conclusion: The causal relationship between low registered nurse staffing and mortality is plausible and these estimates of relationships from longitudinal studies provide further support. To address residual uncertainties, future studies should be conducted in more than one hospital and using standardised measures when reporting staffing levels. Tweetable abstract: Having more registered nurses on hospital wards is causally linked to reduced mortality new review shows there is little room for doubt @ora_dall @workforcesoton @turnel.


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## What is already known

- Many cross-sectional studies and reviews have demonstrated that higher registered nurse staffing levels are associated with better patient outcomes

[^0]- Longitudinal studies have the potential to establish a temporal link between presumed cause (variation in staffing levels) and effect (variation in patient outcomes)


## What this paper adds

- Evidence from studies at low risk of bias confirmed a beneficial effect of increased registered nurse staffing levels on patient mortality
- Variation in the measurement of staffing inputs means that it remains difficult to estimate the effects of staffing increases
- Evidence about the effect of staff other than registered nurses, including assistants, is unclear with mixed evidence showing both benefit and harm


## 1. Introduction

Nursing staff account for half of the health workforce worldwide, and the cost of providing inpatient hospital nursing is one of the main cost drivers for health systems (World Health Organization, 2016). Providing nurse staffing levels that match patient demand is key to deliver cost-effective health services. In the face of increasing financial pressures and budget constraints, registered nurses are sometimes viewed simply as a costly labour input, which can often be substituted with lower paid unregistered staff (Yakusheva et al., 2020). This has raised questions about the contribution of registered nurses and other nurses in the workforce in ensuring patients receive safe and high-quality care, including preventing deterioration, adverse outcomes such as infections and pressure ulcers, and death among hospital inpatients. Besides registered nurses, the nursing workforce comprises of unregistered nursing assistants, and licenced practical nurses/nursing associates, who access the profession by completing a shorter training programme and, therefore, have a reduced scope of practice compared to registered nurses.

When considering the associations between nurse staffing levels, the composition of the nursing workforce (i.e. skill mix) and patient outcomes in inpatient hospital settings, the breadth of the evidence is apparent, with hundreds of studies published to date, most of which support a conclusion that the higher the registered nurse staffing, the lower the rate of adverse patient outcomes, including death and infections (Griffiths et al., 2016). The volume of the evidence has led many to question whether more studies are needed because the implications for policy and practice are clear and the evidence definitive (Buchan et al., 2020; Beech et al., 2019). However, past reviews of this literature (Kane et al., 2007; Shekelle, 2013; Driscoll et al., 2018; Shin et al., 2019; Twigg et al., 2019) have noted the preponderance of cross-sectional studies. Such studies are unable to establish that the observed variation in staffing levels and skill mix between hospitals, typically measured at a hospital level average, corresponded to staffing that was experienced by the patients whose outcomes were measured, typically aggregated at the hospital level over a year.

The limitations of the evidence are such that for some commentators a causal interpretation of the relationship is still questionable, although a careful analysis applying epidemiological principles suggests that the body of evidence is indeed consistent with a cause and effect relationship (Griffiths et al., 2016; Kane et al., 2007). Nonetheless, the indirect associations reported in most studies means it is impossible to estimate the effect of change in staffing levels without bias.

In recent years, there has been a steady increase in studies using routinely collected data in healthcare, including studies that use electronic rostering systems and patient records to link patients to the staffing levels they are exposed to throughout their hospital stay (Musy et al., 2020; Haegdorens et al., 2019). Such studies have the potential to establish the staffing levels that individual patients have been exposed to prior to experiencing the outcome and so directly explore the effect of variation. In addition to removing many potential sources of bias associated with cross-sectional studies, longitudinal studies avoid the intrinsic limitation of cross-sectional studies, as the presumed cause can be shown to precede the outcome of interest. There is no summary of studies using longitudinal designs to explore the impact of staffing levels and skill mix on patient and organisational outcomes in inpatient hospital settings. Therefore, the aim of this systematic review is to summarise the effect of exposure to variation in nurse staffing levels, including skill mix, on subsequent patient outcomes in longitudinal studies.

## 2. Methods

We registered our review protocol in Prospero (PROSPERO 2020 CRD42020191798). We planned to include midwifery staffing in our review, as detailed in our review protocol, but since no studies on midwifery met the inclusion criteria, we framed the paper focusing on nurse staffing only.

### 2.1. Eligibility criteria

To be included, studies must estimate the effect on patients of exposure to varying levels or composition of nursing staff in a hospital inpatient unit (including intensive care units and general wards). Any measure of nurse staffing level or mixture of nursing staff was considered, including staff-to-patient ratios, staff hours per patient day, deviation in staffing from an established norm or reference (e.g. 'low staffing’ relative to a defined standard), measured workload relative to available staffing, or relative mix of registered staff to other groups.

We included prospective, retrospective, cohort, case-control, randomised or quasi-randomised controlled trials, controlled before-and-after studies, interrupted time series, difference-in-difference, or panel studies. To be eligible, studies must establish a temporal link between nurse staffing and patient outcomes, such that measured variation in nurse staffing levels clearly occurred before the outcomes. Studies with repeated measures that used a cross-sectional analysis were excluded except where difference-in-difference designs were used to show an association between change in staffing and change in outcomes over time. We included studies where planned interventions were implemented and natural experiments where the effect of an exogenous 'shock' (e.g. changes in legislation or major policies designed to alter staffing levels) involving a change in staffing was studied. We did not specify a list of patient outcomes a priori, but we defined patient outcomes as any outcomes experienced by patients as opposed to staff, families, and the healthcare systems.

### 2.2. Study selection and data extraction

We searched Medline, CINAHL, Embase and the Cochrane Library. The complete search strategy can be found in Supplementary Material Table 1. Searches were undertaken up to February 2022.

One reviewer (CDO) undertook the first screening to remove duplicates and irrelevant studies. Potentially relevant papers were then further screened with a more detailed assessment of titles and abstracts. At this stage, all other reviewers assessed samples of 10 studies each to ensure that there was consistency, and to identify points of ambiguity and uncertainty in selection criteria. Full texts of studies that remained after this screening were retrieved and detailed assessment was made against the criteria. All full text papers were assessed by CDO and another reviewer. Disagreements were resolved by discussion to reach consensus among all reviewers. From each included study we extracted author(s), year; country and setting; sample size; measure(s) of staffing levels; outcomes and risk-adjustment; findings.

### 2.3. Risk of bias

We used the ROBINS-I tool (Sterne et al., 2016) to assess risk of bias because it supports detailed assessment of confounding, which is important as bias due to omitted variables occurs frequently in studies in this area (Griffiths et al., 2016). The ROBINS-I tool is designed to assess nonrandomised studies and can be used for studies with a cohort design, in which individuals who have been exposed to variation in staffing levels are followed up over time (Sterne et al., 2016). Bias is defined as a tendency for study results to differ systematically from the results expected from hypothetical target randomised trial, conducted on the same participants and with no flaws in its conduct (Sterne et al., 2016). When using
the tool to assess studies of natural variation in staffing we interpreted "intervention" as exposure of patients to different levels of staffing. The hypothetical target trial we identified was a randomised control trial where any patient, upon admission into a hospital unit, is randomly allocated to otherwise identical wards with different staffing levels or skill mix, or a trial in which staffing levels were varied at random (within constraints) throughout the patient's stay. For natural experiments the target trial was a cluster randomised controlled trial assessing the same intervention or policy change.

Using the ROBINS-I tool, the risk of bias due to different methodological aspects (called "domains") was assessed: confounding, selection of participants into the study, classification of interventions, deviation from intended interventions, missing data, measurement of outcomes, and selection of the reported results. A detailed explanation of how to grade each domain is available in the ROBINS-I guidance, where a table for each domain provides clear criteria to guide risk of bias judgements (Sterne et al., 2016). Risk of bias in each domain was graded as either low, moderate, serious, or critical. The domain grade with the highest risk of bias determined the overall risk of bias grade. According to the ROBINS-I guidance (Sterne et al., 2016), we excluded studies at critical risk of bias from our synthesis (Ambrosi et al., 2017; Jansson et al., 2019; Mark and Belyea, 2009; Palese et al., 2016; Twigg et al., 2016) but these studies' characteristics and detailed description of critical risk of bias are reported in Supplementary Material - Table 2. Where we identified a risk of bias we considered whether the mechanisms of bias were likely to be associated with an over- or under-estimate of nurse staffing effects, although in some cases the likely direction of bias was unclear.

Two reviewers independently assessed the risk of bias for each study, and where there was disagreement, this was resolved by collective discussion. As some reviewers were authors of included papers we ensured that at least one reviewer was not an author of the paper in each case and where possible allocated such papers to two non-authors.

### 2.4. Evidence synthesis

We were unable to identify groups of studies that used measures of staffing and outcomes that were sufficiently comparable to pool in a statistical meta-analysis. Therefore, we performed a narrative synthesis with results grouped by outcome. Where studies performed more than one analysis, we reported results at the analysis level rather than summarising them at the study level. Outcome measures were grouped for reporting if they were available in fifteen or more analyses. When less than fifteen analyses reported on the same outcome, we grouped outcomes in common themes.

## 3. Results

Our search yielded 4518 records, of which 946 were duplicates and 3280 were excluded based on title and abstract. We assessed the full text of the remaining 292 studies for eligibility. Of these, 27 published between 2003 and 2021 were included in the review (see Fig. 1). Most studies were single hospital ( $\mathrm{n}=15$ ), but there were some notable exceptions. For example, McHugh et al. included 55 hospitals (McHugh et al., 2021), Hamilton et al. included 54 hospitals (Hamilton et al., 2007) and Mark and Belyea included 145 hospitals (Mark and Belyea, 2009). Patient samples ranged between 85 (Jansson et al., 2019) and 489,155 (McHugh et al., 2021). Twelve studies were conducted in Intensive Care Units (ICU); three in Acute Medical Units; twelve in a variety of inpatient wards, which could also include ICUs. Studies were conducted in the United States $(n=9)$, United Kingdom ( $n=5$ ), Canada $(n=4)$, Australia $(n=3)$, Switzerland ( $n=3$ ), Italy ( $\mathrm{n}=2$ ) and Finland $(\mathrm{n}=1)$. Nurse staffing levels were measured in a variety of ways, and these are summarised in Table 1. Some studies used multiple measures of staffing, for example both cumulative sum of nursing hours per patient day across all stay and for only part of a patient stay (i.e. first two or five days of patient stay). Descriptive
information of studies including settings, designs, sample sizes, data sources, outcomes, risk adjustment and analysis level and type are displayed in Table 2.

The "exposure window" (i.e. the period of staffing measured prior to the outcome) ranged between 6 h (Al-Abdwani et al., 2018) and 30 days in studies with individual patient exposures (Mark and Belyea, 2009). In studies considering policy implementations, staffing and outcomes relationships were measured one year after implementation (McHugh et al., 2021; Twigg et al., 2016). Twelve studies considered staffing levels averaged or summed cumulatively for the whole patient stay, while six considered staffing in the early part of the patient stay only, ranging between the first day and the first seven days of the patients' stay (see supplementary material Table 3).

### 3.1. Risk of bias

Details of the risk of bias assessments by study are given in Supplementary Material Table 4a and b. Of the 27 studies, only three were assessed as at overall low risk of bias, seven were at moderate risk of bias, and twelve were classified as at serious risk of bias. Five studies were at critical risk of bias and so results are not reported below.

Eleven studies had serious risk of bias resulting from confounding. Studies lacked appropriate adjustment for risk of adverse outcome at baseline and/or failed to address time-varying confounding resulting from potential staffing increases as a response to worsening of a patients' condition. Bias in selection of participants into the study was either low or moderate, apart from one study of the implementation of staffing policies, which was classified as serious risk of bias due to the selection of units and hospitals which implemented staffing interventions and controls, which was not random. Bias in classification of interventions was found to be serious only in one study because the majority of studies used routinely collected data from reliable sources to determine staffing levels. One study had a serious risk of bias in the domain of deviation from interventions, as there was no evidence that cointerventions (temporary staffing levels) were balanced across intervention groups. Bias due to missing data was low or moderate in all studies apart from one, where authors report there are missing data, but do not quantify the magnitude. One study had a serious risk of bias arising from outcome measurement as procedures for monitoring the outcome were not reported; other studies had either low or moderate risk of bias. Six studies were potentially affected by bias in results reporting as they presented several subgroup analyses that were not justified in the methods and did not appear to be pre-planned.

In many studies, the direction of bias was unpredictable. However, in eight studies with a serious or critical risk of bias, lack of individual riskadjustment would likely bias results in favour of lower staffing or attenuate any observed effects from higher staffing. Failure to include known predictors of the outcome in statistical models could have led to estimates favouring lower staffing levels because patients at low risk of experiencing a negative outcome have lower need and may consequently be exposed to lower staffing (He et al., 2013; Antonakis et al., 2010). On the other hand, in two studies failure to control for levels of other staff could lead to an overestimate of the benefits of higher nurse staffing levels because the nurse staffing measure was likely to correlate with staffing by other staff groups and these staff groups have an effect on outcomes. While some other studies had no direct control for other staff groups the effect of the omission was less predictable as the design meant that variation in nurse staffing was unlikely to be correlated with that of other staff groups or else there was evidence presented for a lack of correlation.

### 3.2. Mortality

Most analyses showed higher nurse staffing to be associated with reduced mortality. Ten studies reported 33 analyses on patient mortality.

also combined registered nurse and nursing assistant staffing levels in two analyses and found patients exposed to lower staffing levels from both groups were more likely to die (Needleman et al., 2020). Skillmix was explored in one study only, and it was not associated with patient mortality (Rochefort et al., 2020).

Three analyses from one study at serious risk of bias in one hospital with 138,133 patients found that exposure to higher levels of temporary registered nurse and nursing assistant staffing were associated with higher patient mortality. For registered nurses this effect was statistically significant only when a high number of registered nurse hours, equivalent to between one third and one half of the average ward staffing complement, were from temporary nurses $(\mathrm{HR}=1.12 ; 95 \% \mathrm{CI}=1.03-1.21$ ) (Dall'Ora et al., 2020).

### 3.3. Infections

Sixteen analyses from seven studies examined the impact of staffing levels on infections, including central venous catheter associated bloodstream infections, early and late onset ventilator-associated pneumonia, and healthcare-associated infections. Overall, there was inconclusive evidence of the effect of nurse staffing levels on infections, although results generally favoured higher registered nurse staffing levels. Effect estimates are reported in Table 4.

Eight analyses from seven studies found no statistically significant associations with registered nurse staffing levels, although most point estimates, when available, showed a protective effect of higher registered nurse staffing (Alonso-Echanove et al., 2003; Beltempo et al., 2017; Hugonnet et al., 2007a; Hugonnet et al., 2007b; Shang et al., 2019). The exception was a single analysis in one of the two neonatal ICUs where higher RN hours per patient day were associated with higher hazard of infection in one unit and lower hazard in the other (not statistically significant) (Cimiotti, 2004; Cimiotti et al., 2006) In
adult intensive care settings (Hugonnet et al., 2007a; Hugonnet et al., 2007b) and adult hospital settings (Shang et al., 2019) higher registered nurse staffing was associated with a statistically significant reduction in infections.

One analysis found that higher nursing assistant staffing levels were associated with lower risk of healthcare-associated infections (Shang et al., 2019) while two analyses found no statistically significant relationships between nursing assistant staffing and infections (point estimates not reported) (Alonso-Echanove et al., 2003; Shang et al., 2019). One analysis found that patients exposed to days with higher levels of temporary nurse staffing were more likely to experience central venous catheter-associated bloodstream infections (Alonso-Echanove et al., 2003).

### 3.4. Other outcomes

In a single site study of 138,133 patients, Griffiths and colleagues examined the effect of staffing levels on a composite outcome of adverse events, including death, cardiac arrest or unplanned ICU admission. Exposure to higher than the mean registered nurse hours per patient day in the first five days of a hospital admission was associated with a reduced hazard of experiencing adverse events ( $\mathrm{HR}=0.98$; $95 \%$ $\mathrm{CI}=0.96-0.99$ ). Results for nursing assistant hours per patient day were in the opposite direction, although not statistically significant ( $\mathrm{HR}=1.01 ; 95 \% \mathrm{CI}=0.99-1.02$ ) (Griffiths et al., 2018b).

Patrician and colleagues examined the effect of staffing levels and skill mix on hospital-acquired pressure injuries in 13 hospitals and 1643 patients through 12 distinct analyses, exploring various exposure windows and skill mix configurations. The majority (10/12) of these analyses found no statistically significant associations, but two analyses found that a skill mix richer in licenced practical nurses over the previous three days ( $\mathrm{HR}=0.27$ (no $95 \% \mathrm{CI}$ reported)) and one week ( $\mathrm{HR}=0.56$

Table 1
Frequency of staffing level and skill mix measures used in included studies.

| Staffing measure | Number of studies | Studies |
| :---: | :---: | :---: |
| Staffing levels |  |  |
| Studies considering absolute staffing levels |  |  |
| Patient-to nurse ratio | 9 | (Callaghan et al., 2003, Rochefort et al., 2020, Hugonnet et al., 2007a, Hugonnet et al., 2007b, Alonso-Echanove et al., 2003, McHugh et al., 2021, Jansson et al., 2019, Mark and Belyea, 2009) |
| Nurse Hours per Patient Day | 4 | (Cimiotti, 2004, Cimiotti et al., 2006, Tschannen, 2005, Palese et al., 2016) |
| Nurse Hours per Patient per 12-hour shift | 1 | (Needleman et al., 2020) |
| Nurse Hours per shift | 1 | (Rochefort et al., 2020) |
| Nurses per shift | 1 | (Hamilton et al., 2007) |
| Nurses prior to the event | 1 | (Al-Abdwani et al., 2018) |
| Studies considering relative to a defined standard |  |  |
| Days with staffing below unit mean | 2 | (Griffiths et al., 2018b, Griffiths et al., 2019) |
| Shifts with low Nurse Hours per Patient per Shift ("low" was defined differently in each study) | 2 | (Needleman et al., 2020, Shang et al., 2019) |
| Nurse hours per patient day relative to the mean | 2 | (Fogg et al., 2021, Griffiths et al., 2019) |
| Nurses available divided by the number of recommended nurses per shift | 2 | (Hamilton et al., 2007, Beltempo et al., 2017) |
| RN minutes per day at weekend vs weekday | 1 | (Ambrosi et al., 2017) |
| Nurse Hours worked divided by the total number of required hours of care based on patient dependency categories | 1 | (Beltempo et al., 2018) |
| $50 \%$ above/below median number of RN expected | 1 | (Musy et al., 2021) |
| Nurse Hours per Patient Day $\geq 8 \mathrm{~h}$ below requirement | 1 | (Needleman et al., 2011) |
| Shifts with Nurse Hours lower than expected by $\geq 8 \mathrm{~h}$ | 1 | (Rochefort et al., 2020) |
| Composition/staff mix of the nursing team |  |  |
| Skill mix (RNs/RNs + LPNs + NAs) | 2 | (Patrician et al., 2017, Mark and Belyea, 2009) |
| Skill mix (NA/RNs + LPN + NAs) | 1 | (Patrician et al., 2017) |
| Skill mix (LPN/RNs + LPN + NAs) | 1 | (Patrician et al., 2017) |
| Skill mix per shift (NonRN/RN + NonRN) | 1 | (Rochefort et al., 2020) |
| Being cared for by float nurses for $>60 \%$ of the time | 1 | (Alonso-Echanove et al., 2003) |
| Days with additional Temporary Nurse Hours per Patient Day | 1 | (Dall'Ora et al., 2020) |
| Specialist nurses available divided by the number of recommended specialist nurses per shift | 1 | (Hamilton et al., 2007) |
| Ratio of ICU trained to trainee nurses | 1 | (Hugonnet et al., 2007a) |

RN: Registered Nurse; NA: Nursing Assistant; LPN: Licenced Practical Nurse;
Table 2
Settings, designs, sample sizes, data sources, outcomes, risk adjustment and analysis level \& type for included studies.

| Author(s), year | Country \& setting | Design \& Data collection period | Sample size | Data source (routine, survey) | Outcome | Risk-adjustment | Analysis level \& type |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Al-Abdwani et al., 2018 | Canada; Paediatric ICU and Cardiac ICU | Retrospective observational; 01/2004-01/2015 | $\begin{aligned} & \text { Hospitals }=1 ; \text { ICUs }=2 \text {; } \\ & \text { Nurses }=\mathrm{N} / \mathrm{A} ; \text { Patients } \\ & =\mathrm{N} / \mathrm{A} ; \text { Patient } \\ & \text { admissions }=11,310 \end{aligned}$ | Outcomes: patient safety database + electronic health records Nurse staffing: electronic health records | Use of positive pressure ventilation within 24 h of unplanned extubation. | Age, gender, intubation reason, intubation duration, ICU day of the event, secretions, previous intubations, shared room, day time, weekday, ICU census, ICU vent census, Nasal intubation, cuffed endotracheal tube, endotracheal tube taped, high endotracheal tube, re-tape endotracheal tube, chest radiograph, clinical activities, conventional ventilations, nurse ICU experience, respiratory therapists. | Patient-day level; Logistic regression |
| Alonso-Echanove et al., 2003 | USA; <br> Medical ICU; <br> Surgical ICU | Prospective observational; 12/1997-12/1999 | $\begin{aligned} & \text { Hospitals }=6 ; \text { ICUs }=8 \text {; } \\ & \text { Patients }=4535 \text {; Nurses } \\ & =\mathrm{N} / \mathrm{A} \end{aligned}$ | All: Daily survey. Data were collected by infection control practitioners and sent to the $C D C$. | CVC-associated blood stream infections. | CVC in a patient unarousable for more than $70 \%$ of the CVC-days, an interaction term for TPN and non-antimicrobial-impregnated CVCs, patient not receiving antibiotics within 48 h of the CVC insertion, the use of peripherally inserted central catheters, patient in age category $45-55$ yrs. old | Patient level; Cox proportional hazard model |
| $\begin{aligned} & \text { Beltempo et al., } \\ & 2017 \end{aligned}$ | Canada; Neonatal ICU | Case control; 04/2011-03/2013 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & \text { 1; Nurses = 165; } \\ & \text { Patients = } 2236 \end{aligned}$ | Outcomes: Clinical database Staffing levels: Administrative data feeding into payroll | Healthcare associated infection | Nurse overtime, unit occupancy, $\mathrm{n}^{\circ}$ patients with central lines, no of acutely ill patients and the no of daily admissions | Ward-day level; Logistic regression |
| $\begin{aligned} & \text { Beltempo et al., } \\ & 2018 \end{aligned}$ | Canada; <br> Neonatal ICU | Cohort study; 03/2011-06/2014 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 1 ; \text { Nurses }=165 ; \\ & \text { patients }=257 \end{aligned}$ | Outcomes: local Canadian Neonatal Network database. Nurse staffing: administrative software used for scheduling and payroll | Mortality (all causes) or major morbidity. | Gestational age, sex, small for gestational age status, outborn, SNAP-II score more than 20, mode of delivery, overtime and occupancy for the first day of admission, first 7 days and NICU hospitalizations | Patient level; Multi-variable log-binomial regression |
| Callaghan et al., 2003 | Australia; <br> Neonatal ICU | Cohort study; 01/1996-12/1999 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 1 ; \text { Patients }=692= \end{aligned}$ | All: Routinely collected data from electronic systems | In-hospital mortality | Initial risk using the Clinical Risk Index for Babies (CRIB) score, and dependency areas (ICU, high dependency, medium dependency or recovery) | Patient level; Logistic regression |
| Cimiotti et al., 2004; Cimiotti et al., 2006 | USA; <br> Neonatal ICU | Cohort study; 03/2001-02/2003 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 2 ; \text { Patients }=2675 \end{aligned}$ | Outcome: Clinical data from patients' records. Nurse staffing: Nurse Staffing Office of each ward | Healthcare associated bloodstream infection | Birth weight, catheter use, major surgery, total parenteral nutrition, hand hygiene product used by staff | Patient level; Cox proportional hazards regression |
| $\begin{aligned} & \text { Dall'Ora et al., } \\ & 2020 \end{aligned}$ | UK; General hospital, medical/surgical | Retrospective; 04/2012-04/2015 | Hospitals $=1$; Wards $=$ <br> 32; Patients = 138,133; <br> RNs $=1244 ;$ HCAs $=$ <br> 700; Nursing shifts $=$ <br> 761,946 | Outcome: Patient Administration System Nurse staffing: Electronic rostering system + bank \& agency database | In-hospital mortality | National Early Warning Score on admission; Summary Hospital Mortality Indicator risk score; emergency vs. elective admissions; admissions per $\mathrm{RN}>125 \%$ of unit mean; admissions per NA > $125 \%$ of unit mean; RN staffing below unit mean; NA staffing below unit mean. | Patient level; hierarchical mixed-effects survival |
| Fogg et al., 2021 | UK; <br> General hospital, medical/surgical | Retrospective; 01/2014-04/2015 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 32 ; \text { Patients }=9643 \end{aligned}$ | Outcome: Patient Administration System Nurse staffing: Electronic rostering system + bank \& agency database | 1) Death in hospital or within 30 days of dischargeUnplanned readmission to hospital within 30 days of discharge | Age; cognitive impairment; primary diagnosis group, based on Summary Hospital Mortality Indicator (SHMI) Clinical Coding System (CCS) bundles (original diagnoses use International Classification of Disease 10); Charlson co-morbidity index (CCI); NEWS value at admission; MUST score at admission; Route of admission; Ward transfers; Discharge specialty | Patient level; hierarchical mixed-effects survival |
| $\begin{aligned} & \text { Griffiths et al., } \\ & \text { 2018a, 2018b } \end{aligned}$ | UK; <br> General hospital, medical/surgical | Retrospective; 04/2012-04/2015 | Hospitals $=1$; Wards $=$ <br> 32; Patients $=138,133$; <br> RNs $=1244 ;$ HCAs $=$ <br> 700; Nursing shifts $=$ <br> 761,946 | Outcome: cardiac arrest audit and ICU WardWatcher; Length of stay: Patient Administration System Nurse staffing: Electronic rostering system + bank \& agency database | 1) Adverse events (death, cardiac arrest or unplanned ICU admission)Length of stay in the hospital | NEWS on admission; SHMI risk score; age; Charlson co-morbidity index (CCI); primary diagnosis group; Type of admission (elective vs emergency); Admissions per RN of $>125 \%$ of ward mean; Admissions per HCA of $>125 \%$ of ward mean | Patient level; hierarchical mixed-effects survival |
| $\begin{aligned} & \text { Griffiths et al., } \\ & 2019 \end{aligned}$ | UK; General hospital, | Retrospective; 04/2012-04/2015 | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 32 ; \text { Patients }=138,133 ; \end{aligned}$ | Outcome: Patient Administration System | In-hospital mortality | National Early Warning Score on admission; Summary Hospital Mortality Indicator risk score; emergency vs. | Patient level; hierarchical |


| $\begin{aligned} & \text { Hamilton et al., } \\ & 2007 \end{aligned}$ | medical/surgical <br> UK; <br> Neonatal ICU | Cohort study; 01/1998-04/1999 | $\begin{aligned} & \text { RNs }=1244 ; \text { HCAs }= \\ & 700 ; \text { Nursing shifts }= \\ & 761,946 \\ & \text { Hospitals }=54 \\ & \text { Wards }=54 ; \text { Patients }= \\ & 2585 \end{aligned}$ | Nurse staffing: Electronic rostering system + bank \& agency database Outcome: recorded by research nurses Nurse staffing: recorded by research nurses twice daily | Death before discharge and planned deaths at home (excluded lethal malformations \& deaths post specialist surgery) | elective admissions; admissions per RN > $125 \%$ of unit mean; admissions per NA > $125 \%$ of unit mean; RN staffing below unit mean; NA staffing below unit mean Gestational age, gender, birth weight and mode of delivery, diagnostic category, maternal treatment with antenatal steroids, admission temperature, most extreme partial pressure of carbon dioxide ( PaCO 2 ), mean appropriate fraction of inspired oxygen (FiO2), and lowest base excess | mixed-effects survival <br> Patient level; Logistic regression |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Hugonnet et al., 2007a | Switzerland; Medical ICU | Cohort; 01/1999-12/2002 | ```Hospitals = 1; Wards= 1; Patients = 1883; Patient-days = 10,637``` | Outcome: not specified Staffing levels: not specified | Healthcare associated infection | Presence of CVC, Ventilation, Urinary catheter, Antibiotics | Ward-day; Poisson regression |
| Hugonnet et al., 2007b | Switzerland; <br> Medical ICU | Cohort; $01 / 1999-12 / 2002$ | $\begin{aligned} & \text { Hospitals }=1 ; \text { Wards }= \\ & 1 ; \text { patients }=2470 \end{aligned}$ | Outcome: not specified Staffing levels: not specified | Ventilator-Associated pneumonia; early-onset: 1-5 days after intubation; late-onset: after day 6) | For early-onset VAP adjusted for: Charlson score (comorbity index), having a CVC, being on a therapeutic antibiotic. For late-onset VAP: nursing acuity severity score, pulmonary disease, having a CVC, a peripheral venous line, and receiving therapeutic antibiotic | Patient level Cox regression analysis |
| McHugh et al., 2021 | Australia, acute care hospitals | Prospective panel study; 2016 vs 2018 | Hospitals $=55$; nurses $=17,010$; Patients $=$ 231,902 at baseline, 257,253 post-implementation | Nurse staffing: Nurse survey <br> Outcomes: Queensland Hospital Admitted Patient data and death records | 1) 30-day mortality <br> 2) 7-day readmissionsLength of stay | 1) 2) 3): Hospital size; 1) and 2): 17 indicators from the Charlson Comorbidity Index, sex, age, and DRG | Hospital level; <br> 1)\&2) multilevel logistic regression; <br> 3) zero-truncated negative binomial regression |
| Musy et al., 2021 | Switzerland; Adult hospital | Observational study; 2015-2017 | $\begin{aligned} & \text { Hospital }=1 ; \text { Wards } \\ & =55 ; \text { Patients }=79,893 ; \\ & \text { RNs }=3646 ; \text { LPNs }= \\ & 438 \end{aligned}$ | Outcome: medical discharge data Nurse staffing: tacs ${ }^{\circledR}$ nurse staffing system | Inpatient mortality | Age; gender; residence before hospital admission; type of admission; decision-maker regarding admission; stay in Intensive Care; stay in emergency; LOS; $\mathrm{n}^{\mathrm{o}}$ of transfers; no of ICD-10-GM diagnoses | Patient level; Logistic regression |
| Needleman et al., 2011 | USA; Tertiary academic medical centre | Observational study; 2003-2006 | ```Hospital = 1; Wards = 43 Admissions = 197,961; Shifts = 176,696``` | All: Electronic data systems of the medical centre, electronic discharge abstracts | In-hospital mortality. | Each patient was assigned a predicted in-hospital mortality value based on the patient's diagnosis-related group (DRG). | Patient level. <br> Cox proportional hazard |
| Needleman et al., $2020$ | USA; <br> Academic health system | Observational; 2007-2012 | Hospitals $=3$ ( 2 tertiary and 1 community); Admissions: 78,303 | Outcome: discharge summary. <br> Nurse staffing: hospital payroll system. | In-hospital mortality | Age, gender, Charlson comorbidity score and month/year | Patient level. Cox proportional hazards |
| Patrician et al., 2017 | USA; medical-surgical, stepdown and critical care units of military hospitals | Secondary longitudinal; 2003-2006 | Hospitals $=13$; Wards $=56$ Patients $=1643$; Shifts $=13,590$ | All: prevalence surveys collected annually from the Military Nursing Outcomes Database (MilNOD) project | Hospital-acquired pressure injury (HAPI) development (stage 2 or greater) | Age, Braden score, albumin, BUN, creatinine, unit day level, census, turnover and patient acuity | Patient level. <br> Cox proportional <br> hazards and <br> generalised <br> estimating equations |
| Rochefort et al., 2020 | Canada; Adult medical, surgical, and ICU | Observational; 2010-2017 | ```Hospitals = 1; Wards = 32; Patients = 146,349``` | Outcome: Patient administration data from discharge abstracts Nurse staffing: Payroll data | In-hospital mortality | Age, gender; Charlson Comorbidity Index; severity of illness on admission; Hospital admission type; unit of admission; year and month of admission; type of unit; timing of shift; current unit occupancy; weekend/statutory holiday; cumulative proportion of shifts spent in ICU; and the square of that cumulative proportion. | Patient level. <br> Multivariable Cox <br> proportional <br> hazards regression |
| Shang et al., 2019 | US; <br> tertiary/quaternary <br> \& community <br> hospitals | Observational; 2007-2012 | Hospitals $=3$; Wards $=$ 34 ; Patients $=100,264$; shifts $=66,871$ | Outcome: patient administrative system, clinical data warehouse, electronic health record system <br> Nurse staffing: hospital payroll | Healthcare Associated Infections (urinary tract, bloodstream and pneumonia) | Patient individual factors; unit type, year, and patient turnover discharges | Patient level; <br> Cox <br> proportional-hazards regression |
| Tschannen, 2005 | US, inpatient medical and surgical wards | Prospective; 03/2004-04/2004 | $\begin{aligned} & \text { Hospitals }=2 ; \text { wards }= \\ & 4 ; \text { nurses }=135 ; \\ & \text { patients }=310 \end{aligned}$ | Outcome: discharge data Nurse staffing: payroll records and census log for nurse staffing | 1) Length of stay in the unitDeviation from expected LOS: expected length of stay was determined using Diagnostic Related Groups. | Gender, age, primary diagnosis (from DRG), Roman-Charlson Comorbidty index for co-morbidities; admission type (medical vs surgical); admission source (A\&E, ICU, post-op); unit of admission | Patient level; regression analysis |

Table 3
Mortality effect estimated for studies reporting variation in registered nurse staffing levels.

| Authors, year | Staffing measure | Staffing group | Exposure window | Outcome | Result | Risk of bias |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Effect of lower RN staffing |  |  |  |  |  |  |
| Callaghan et al., 2003 | Patient to nurse ratio of 1.71-1.97 | RN | Averaged across first 72 h of stay | In-hospital mortality | Compared to exposure to ratio $\begin{aligned} & 1.16-1.58: \mathrm{OR}=0.18 ; 95 \% \mathrm{CI}= \\ & 0.06-0.5^{*} \end{aligned}$ | Serious |
| $\begin{aligned} & \text { Callaghan et al., } \\ & 2003 \end{aligned}$ | Patient to nurse ratio of 1.59-1.70 | RN | Averaged across first 72 h of stay | In-hospital mortality | Compared to exposure to ratio $\begin{aligned} & 1.16-1.58: \mathrm{OR}=0.84 ; 95 \% \mathrm{CI}= \\ & 0.42-1.66 \end{aligned}$ | Serious |
| Griffiths et al., 2019 | Days with staffing below the unit mean | RN | Cumulative sum of days over the first 5 days of stay | In-hospital mortality | $\mathrm{HR}=1.03 ; 95 \% \mathrm{Cl}=1.01-1.06$ * | Low |
| Needleman et al., 2011 | Nurse Hours per Patient Day $\geq 8$ h below requirement | RN | Cumulative sum across all stay | In-hospital mortality | $\mathrm{HR}=1.02 ; 95 \% \mathrm{Cl}=1.01-1.03^{*}$ | Moderate |
| Needleman et al., 2011 | Nurse Hours per Patient Day $\geq 8$ h below requirement | RN | Cumulative sum of first five days of patient stay | In-hospital mortality | $\mathrm{HR}=1.03 ; 95 \% \mathrm{Cl}=1.02-1.05^{*}$ | Moderate |
| Needleman et al., 2011 | Nurse Hours per Patient Day $\geq 8 \mathrm{~h}$ below requirement | RN | Cumulative sum of 2 shifts prior to death | In-hospital mortality | $\mathrm{HR}=1.05 ; 95 \% \mathrm{Cl}=1.02-1.07^{*}$ | Moderate |
| Needleman et al., $2020$ | Nurse hours per patient per 12-h shift | RN | Any shift with staffing below $75 \%$ of annual median unit | In-hospital mortality | $\mathrm{HR}=1.02 ; 95 \% \mathrm{Cl}=1.00-1.05^{*}$ | Moderate |
| Needleman et al., $2020$ | Number of shifts with low nurse hours per patient per shift | RN | Cumulative sum over the 2nd to 5th day of stay | In-hospital mortality | $\mathrm{HR}=1.04 ; 95 \% \mathrm{CI}=0.99 ; 1.10$ | Moderate |
| Rochefort et al., 2020 | Shifts with nurse hours lower than expected by $\geq 8 \mathrm{~h}$ | RN | Cumulative sum across stay | In-hospital mortality | $\mathrm{HR}=1.01 ; 95 \% \mathrm{Cl}=1.00-1.01^{*}$ | Low |
| Effect of higher RN staffing |  |  |  |  |  |  |
| Beltempo et al., 2018 | Total number of nurse hours worked divided by the total number of required hours of care based on patient dependency categories | RN | First day of NICU stay | Mortality (all causes) or major morbidity | $\mathrm{RR}=0.83 ; 95 \% \mathrm{Cl}=0.77-0.90^{*}$ | Moderate |
| Beltempo et al., 2018 | Number of RN hours worked divided by the number of required hours of care based on patient dependency categories | RN | Averaged across first 7 days | Mortality (all causes) or major morbidity | $\mathrm{RR}=0.82 ; 95 \% \mathrm{CI}: 0.76-0.89^{*}$ | Moderate |
| $\begin{aligned} & \text { Beltempo et al., } \\ & 2018 \end{aligned}$ | Total number of nurse hours worked divided by the total number of required hours of care based on patient dependency categories | RN | Averaged across patient stay | Mortality (all causes) or major morbidity | $\mathrm{RR}=0.81 ; 95 \% \mathrm{Cl}=0.74-0.90^{*}$ | Moderate |
| Fogg et al., 2021 | RN hours per patient day relative to the mean (with non-linear terms) | RN | Averaged across patient stay relative to the mean | In-hospital mortality and within 30 days of discharge | Mean vs mean +0.5 Registered Nurse Hours per Patient Day: OR $=0.90 ; 95 \% \mathrm{CI}=0.84-0.97^{*}$ | Moderate |
| Griffiths et al., 2019 | RN hours per patient day relative to the mean | RN | Cumulative sum over first 5 days of stay | In-hospital mortality | $\mathrm{HR}=0.97 ; 95 \% \mathrm{Cl}=0.94-0.99^{*}$ | Low |
| $\begin{aligned} & \text { Hamilton et al., } \\ & 2007 \end{aligned}$ | Number of nurses per shift | RN | Averaged across patient stay | Death before discharge and planned deaths at home | No estimates - reported as nonsignificant | Moderate |
| Hamilton et al., 2007 | Number of nurses available divided by the number of recommended nurses per shift | RN | Averaged across patient stay | Death before discharge and planned deaths at home | No estimates - reported as nonsignificant | Moderate |
| Musy et al., 2021 | High/low staffing ( $50 \%$ above/below median number of RN expected given ward, patient activity \& shift type) | RN | Cumulative count of shifts with high numbers across all stay | In-hospital Mortality | Higher staffing: $\mathrm{OR}=0.91^{*}$; $95 \%$ $\mathrm{CI}=0.89-0.93$ | Low |
| Rochefort et al., 2020 | Nurse/patient ratio | RN | Cumulative sum across stay | In-hospital mortality | No estimates - reported as nonsignificant | Low |
| Rochefort et al., $2020$ | Nurse hours per shift | RN | Cumulative sum across stay | In-hospital mortality | No estimates - reported as nonsignificant | Low |
| Effect of skill mix \& higher total nurse staffing |  |  |  |  |  |  |
| Hamilton et al., 2007 | Number of specialist nurses available divided by the number of recommended specialist nurses per shift | RN | Averaged across patient stay | Death before discharge and planned deaths at home | $\mathrm{OR}=0.63 ; 95 \% \mathrm{CI}=0.42-0.96$ * | Hamilton <br> et al., 2007 |
| Needleman et al., 2020 | Number of shifts with low nurse hours per patient per shift | $\begin{aligned} & \text { RN }+ \\ & \text { NA } \end{aligned}$ | Any shift with staffing below $75 \%$ of annual median unit | In-hospital mortality | $\mathrm{HR}=1.02 ; 95 \% \mathrm{Cl}=1.00-1.04^{*}$ | Needleman <br> et al., 2020 |
| Needleman et al., 2020 | Number of shifts with low nurse hours per patient per shift | $\begin{aligned} & \text { RN + } \\ & \text { NA } \end{aligned}$ | Cumulative sum over the 2nd to 5th day of stay | In-hospital mortality | $\mathrm{HR}=1.13 ; 95 \% \mathrm{Cl}=1.08-1.18^{*}$ | Needleman et al., 2020 |
| Rochefort et al., 2020 | Skill mix per shift (NonRN/RN + NonRN) | RN, <br> NonRN | Cumulative sum across stay | In-hospital mortality | $\mathrm{HR}=1.00 ; 95 \% \mathrm{CI}=0.99-1.01$ | Rochefort <br> et al., 2020 |
| Effect of lower assistant staffing |  |  |  |  |  |  |
| Griffiths et al., 2019 | Days with staffing below the unit mean | NA | Cumulative sum of | In-hospital | $\mathrm{HR}=1.04 ; 95 \% \mathrm{Cl}=1.02-1.07^{*}$ | Low |

Table 3 (continued)

| Authors, year | Staffing measure | Staffing group | Exposure window | Outcome | Result | Risk of bias |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Musy et al., 2021 | High/low staffing (50\% above/below median number of RN expected given ward, patient activity \& shift type) | LPN | days over the first 5 days of stay Cumulative count of shifts with high numbers across all stay | mortality <br> In-hospital mortality | Lower staffing: $\text { OR }=0.99 ; 95 \% \mathrm{CI}=0.96-1.01$ | Low |
| Needleman et al., $2020$ | Nurse hours per patient per 12-h shift | NA | Cumulative sum over the 2nd to 5th day of stay | In-hospital mortality | $\mathrm{HR}=1.03 ; 95 \% \mathrm{Cl}=1.00-1.05^{*}$ | Moderate |
| Needleman et al., 2020 | Nurse hours per patient per 12-h shift | NA | Any shift with staffing below $75 \%$ of annual median unit | In-hospital mortality | $\mathrm{HR}=1.03 ; 95 \% \mathrm{Cl}=1.01-1.04^{*}$ | Moderate |
| Effect of higher assistant staffing |  |  |  |  |  |  |
| Fogg et al., 2021 | Hours per patient day relative to the mean (with non-linear terms) | NA | Averaged across patient stay relative to the mean | In-hospital mortality and within 30 days of discharge | Additional NA Hour: $\mathrm{OR}=1.12$, $95 \% \mathrm{Cl}=0.91-1.39$ | Moderate |
| Griffiths et al., 2019 | Hours per patient day relative to the mean | NA | Cumulative sum of days over the first 5 days of stay | In-hospital mortality | $\mathrm{HR}=1.01 ; 95 \% \mathrm{CI}=0.98-1.04$ | Low |
| Musy et al., 2021 | High/low staffing ( $50 \%$ above/below median number of RN expected given ward, patient activity \& shift type) | LPN | Cumulative count of shifts with high numbers across all stay | Mortality | Higher staffing: $\mathrm{OR}=0.97$; $95 \%$ $\mathrm{CI}=0.96-0.99^{*}$ | Low |

* Statistically significant at $<0.05$; OR = Odds Ratio; $\mathrm{HR}=$ Hazard Ratio; $\mathrm{RR}=$ Risk Ratio; CI $=$ Confidence Interval; RN = Registered Nurse; $\mathrm{NA}=$ Nursing Assistant; LPN $=$ Licenced Practical Nurse.
(no $95 \% \mathrm{CI}$ reported)) reduced the hazard of hospital-acquired pressure injuries (Patrician et al., 2017).

Griffiths and colleagues found that patients' length of stay in hospital was reduced by a mean of 0.23 days for each additional registered nurse hours per patient day that a patient experienced (Gamma coefficient $=$ $-0.23 ; 95 \% \mathrm{CI}=-0.30--0.16$ ), while there was a small but statistically significant increase in stay for each additional nursing assistant hours per day a patient was exposed to throughout their stay (Gamma coefficient $=$ $0.076 ; 95 \% \mathrm{Cl}=0.03-0.13$ ) (Griffiths et al., 2018b). Tschannen found that being exposed to higher nursing hours per patient day was associated with shorter than expected stays (relative to Diagnoses Related Groups based norms) ( $B=2.481, \mathrm{SE}=1.0$ ), but not overall average length of stay ( $B=0.43, S E=0.01$ ) (Tschannen, 2005). A single site study of 9643 patients over the age of 75 who received a cognitive screening, found that patients exposed to an additional 0.5 registered nurse hours per patient day had a reduced risk of readmission, although this was not statistically significant ( $\mathrm{OR}=0.94 ; 95 \% \mathrm{CI}=0.82-1.06$ ) (Fogg et al., 2021).

One study in two ICUs (one paediatric and one cardiac) and 11,310 admissions found that patients were more likely to receive positive pressure ventilation following unplanned extubation when there were more registered nurses in the preceding $6 \mathrm{~h}(\mathrm{OR}=1.53 ; 95 \% \mathrm{CI}$ : 1.11-2.12) (Al-Abdwani et al., 2018).

### 3.5. Staffing policies

One study examining the effect of staffing policy interventions was included in our review (McHugh et al., 2021). It was a prospective panel study compared patient outcomes in hospitals that implemented a minimum nurse-to-patient ratio policy. Twenty-seven hospitals were subject to the staffing policy and 28 were not. Reducing workloads by one patient per nurse was associated with a decrease in 30 -day mortality ( $\mathrm{OR}=0.93$; $95 \% \mathrm{CI}=0.86-0.99$ ), 7 -day readmissions ( $\mathrm{OR}=0.93 ; 95 \% \mathrm{CI}=0.89-0.97$ ) and length of stay ( OR $=0.97 ; 95 \% \mathrm{CI}=0.94-0.99)$.

## 4. Discussion

This is the first systematic review of the effect of nurse staffing levels on patient outcomes focusing on longitudinal studies. These studies can
demonstrate a temporal link between exposure to staffing levels and outcomes and thus overcome an intrinsic limitation of the majority of research in this field, which is cross-sectional. While studies were conducted across diverse samples, using different staffing measures and exposure windows, findings are consistent with higher registered nurse staffing reducing the risk of patient death. On the other hand, evidence about the positive contribution of other staff groups and changes to the skill mix of the nursing team is much more mixed although there is some evidence of harm linked to high levels of assistant staffing and temporary staff.

This evidence is consistent with conclusions based primarily on cross-sectional evidence (Griffiths et al., 2016), but when considering criteria to establish a causal relationship, there is a fundamental requirement that cause precedes effect (Hill, 1965; Rothman and Greenland, 2005). Although the evidence reviewed here remains observational, if relevant confounders are controlled for in the analyses, the parameter estimates for exposure can potentially be causally interpreted (Hernán, 2018), although some risk of bias remains. In addition, the causal pathway from low staffing to mortality has been theorised and empirically demonstrated, in part mediated by a failure to observe and mobilise response to deterioration (Smith et al., 2020; Griffiths et al., 2018b; Redfern et al., 2019; Ball et al., 2018).

In our review, studies at higher risk of bias were more likely to lead to an underestimation of the effect of higher nurse staffing than to overestimation. While in theory randomised controlled trials are a stronger study design with superior ability to determine a causal relationship (Higgins et al., 2021), it is not likely to be feasible under many circumstances, nor a guarantee of better quality if the study has risk of bias in other domains or is intrinsically limited by (for example) small sample size or randomisation of a small number of clusters. The three studies at low risk of bias in this review all concluded that exposure to higher staffing levels was associated with lower patient mortality. Studies at low risk of bias are able to provide effect estimates comparable to a well-performed randomised trial.

The diverse exposure windows, diverse settings and patient populations, and long span in which studies were published (i.e. 2003-2021) make it difficult to come to firm conclusions about the size of effects beyond the estimates provided by individual studies. The effect sizes observed for mortality are typically small but the large populations

Table 4
Infections effect estimated for analyses of staffing levels.

| Study | Staffing measure | Staff <br> group | Exposure window | Outcome | Result |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Higher staffing |  |  |  |  |  |
| Hugonnet et al., 2007a | Nurse/patient ratio | RN | Averaged across 4 days prior to infection | Healthcare associated infection | $\mathrm{IRR}=0.69 ; 95 \% \mathrm{CI}=0.50-0.95^{*}$ |
| Hugonnet et al., 2007a | Ratio of ICU trained to trainee nurses | RN | Averaged across 4 days prior to infection | Healthcare associated infection | $\mathrm{IRR}=0.96 ; 95 \% \mathrm{CI}=0.82-1.13$ |
| Cimiotti, 2004; Cimiotti et al., 2006 | Nurse Hours per Patient Day | RN | Averaged from 48 to 144 h before infection | Healthcare associated bloodstream infection | Unit 1: $\mathrm{HR}=1.53 ; 95 \% \mathrm{CI}=0.39-6.07$ <br> Unit 2: $\mathrm{HR}=0.21 ; 95 \% \mathrm{CI}=0.06-0.79^{*}$ |
| Hugonnet et al., 2007b | Nurse/patient ratio | RN | Averaged in the 4 days prior to pneumonia | Early onset <br> Ventilator-Associated <br> Pneumonia | Not significant and not reported |
| $\begin{aligned} & \text { Hugonnet et al., } \\ & \text { 2007b } \end{aligned}$ | Nurse/patient ratio | RN | Averaged in the 4 days prior to pneumonia | Late onset Ventilator Associated Pneumonia | $\mathrm{HR}=0.42 ; 95 \% \mathrm{Cl}=0.18-0.99^{*}$ |
| Alonso-Echanove et al., 2003 | Nurse/patient ratio | RN | Averaged across patient stay | CVC-associated blood stream infections | No estimates - reported as nonsignificant |
| Alonso-Echanove et al., 2003 | Nurse/patient ratio | NA | Averaged across patient stay | CVC-associated blood stream infections | No estimates - reported as nonsignificant |
| Alonso-Echanove et al., 2003 | Being cared for by float nurses for $>60 \%$ of the time | RN | Averaged across patient stay | CVC-associated blood stream infections | $\mathrm{HR}=2.75 ; 95 \% \mathrm{Cl}=1.45-5.22^{*}$ |
| Lower staffing |  |  |  |  |  |
| $\begin{aligned} & \text { Beltempo et al., } \\ & 2017 \end{aligned}$ | Ratio of available to recommended nurses 0.98-0.92 | RN | Three days prior to infection | Healthcare associated infection | Compared to days with ratio $\geq 0.98$ : OR $=1.39 ; 95 \% \mathrm{CI}=0.89-2.20$ |
| Beltempo et al., 2017 | Ratio of available to recommended nurses $0.92-0.86$ | RN | Three days prior to infection | Healthcare associated infection | Compared to days with ratio $\geq 0.98$ : OR $=1.24 ; 05 \% \mathrm{CI}=0.77-2.00$ |
| $\begin{aligned} & \text { Beltempo et al., } \\ & 2017 \end{aligned}$ | Ratio of available to recommended nurses <0.86 | RN | Three days prior to infection | Healthcare associated infection | Compared to days with ratio $\geq 0.98$ : OR $=1.16 ; 95 \% \mathrm{Cl}=0.67-1.99$ |
| Shang et al., 2019 | Number of shifts with low nurse hours per patient shift | RN | Cumulative sum of shifts below $80 \%$ of annual median unit over the two days prior to infection | Healthcare associated infection | No estimates - reported as nonsignificant |
| Shang et al., 2019 | Number of shifts with low nurse hours per patient shift | RN | Any shift below $80 \%$ of annual median unit over the two days prior to infection | Healthcare associated infection | $\mathrm{HR}=1.15 ; 95 \% \mathrm{Cl}=1.02-1.30^{*}$ |
| Shang et al., 2019 | Number of shifts with low nurse hours per patient shift | NA | Cumulative sum of shifts below $80 \%$ of annual median unit over the two days prior to infection | Healthcare associated infection | No estimates - reported as non-significant |
| Shang et al., 2019 | Number of shifts with low nurse hours per patient shift | NA | Any shift below $80 \%$ of annual median unit over the two days prior to infection | Healthcare associated infection | $\mathrm{HR}=1.11 ; 95 \% \mathrm{Cl}=1.01-1.21^{*}$ |

* Statistically significant at $<0.05$; $\mathrm{OR}=$ Odds Ratio; $\mathrm{HR}=$ Hazard Ratio; $\mathrm{RR}=$ Risk Ratio; $\mathrm{CI}=$ Confidence Interval.
exposed to risk means that these effects are, nonetheless, important. In a study that included 138,000 general medical and surgical admissions to one large hospital with approximately 800 medical surgical beds, over 3 years it was estimated that an increase of 1 registered nurse hour per patient day over could avoid 657 deaths and save over 30,000 bed days through reduced length of stay (Griffiths et al., 2018b).

When considering nursing assistants and other grades of nursing staff, the effects observed are mixed, and so a general conclusion and causal inference from these results is more challenging. It seems likely from the evidence that any causal relationship is complex, with the hints of non-linear effects (Griffiths et al., 2019; Musy et al., 2021) suggesting competing causal mechanisms from increased resource (beneficial) as opposed to substitution of registered nurses (harmful). Findings around temporary staffing, albeit from a single study, show that when small proportions of temporary registered nurses are deployed there is no evidence of harm, presumably because staffing levels are being maintained, but when high levels of temporary staff are deployed, the association with mortality changes direction.

Regarding other patient outcomes, there is more uncertainty. This is largely due to higher risk of bias in studies. Nonetheless, the direction of the relationships observed, particularly for infections, pressure ulcers and length of stay, remains compatible with a protective effect of higher nurse staffing levels. While much work has been done already about nurse-sensitive outcomes (Twigg et al., 2015; Griffiths et al., 2008; Blume et al., 2021), the current evidence does not provide a consistent and coherent overview of how nurse staffing affects other patient outcomes. Estimation of the effect of variation in nurse staffing levels on some well-established nurse-sensitive outcomes, including falls and
pressure ulcers, is hampered by inadequate risk-adjustment models, poor recording, and ascertainment bias in the current research.

While there is evidence for the link between nurse staffing levels and mortality that is strong from an internal validity perspective, large-scale longitudinal studies from a larger number of hospitals are needed to increase external validity, improving both the precision and generalisability of estimates. While we did not formally assess external validity, all studies at low risk of bias were conducted in a single hospital, which limits generalisability of findings. Convincingly demonstrating external validity will be crucial to change policy and practice around nurse staffing levels (Glasgow et al., 2006; Burchett et al., 2011).

In addition, we note that staffing levels were measured in a variety of ways across studies. If approaches to measuring staffing inputs were standardised, or if raw anonymised data were provided alongside papers, more comparable estimates could be combined in meta-analyses, and the field of research and practice might be advanced (Manojlovich et al., 2011). While it is difficult to establish the clear superiority of one staffing effect measure over another, we would encourage all authors to offer analyses using measures based on those used in existing reports in addition to any de-novo measures they derive. A way forward might be using a measured staffing requirement as a reference, as used for example by Griffiths et al., 2018a, Needleman et al., 2011, but the diversity of systems for determining staffing requirements and limited evidence for validity of any approach would still make standardisation and comparison challenging (Griffiths et al., 2020). Staffing deviation standardised against unit norms (mean, median) has been used as an absolute (low staffing) and continuous (hours per patient day relative to the norm) effect measure, which could be derived for all studies
irrespective of the underlying methods used to determine staffing requirements, although such methods are limited to estimating the effect of within-unit variation.

### 4.1. Limitations of the review

Although our search was extensive, the topic is difficult to capture precisely in structured searches. As a team we are familiar with the literature and were thus able to test the ability of strategies to identify already known studies and thus be confident about the overall sensitivity of the search, it is still possible that we missed some eligible studies. However, it seems unlikely that we would have missed a number of low-risk of bias studies sufficient to fundamentally change our conclusions or the general picture of the literature that we have presented. Our review was conducted according to a pre-defined protocol, but the diversity of designs we encountered meant that a small number of studies that did not meet our inclusion criteria, but which still explored trends over time were excluded because the measured variation over time did not precede the reported outcome. For example, one study explored staffing over several years and associated annual staffing with annual outcomes (He et al., 2016). While these studies may be informative, they were small in number and their inclusion would not be likely to substantively change our conclusions.

## 5. Conclusions

By focussing on longitudinal studies in this review we have addressed a significant critique of the body of research linking nurse staffing to patient outcomes. While causal conclusions from associations observed in cross-sectional studies may be dismissed as spurious, we have revealed a substantial body of longitudinal evidence, which is harder to dismiss. The evidence reviewed remains observational and potentially subject to bias in estimating effects, but a small number of studies at low risk of bias provide powerful support for a causal interpretation of the findings. Higher registered nurse staffing levels reduce the risk of patient death in acute care settings, although the limited number of studies at low risk of bias makes it difficult to provide generalisable estimates of effect. In contrast with clear evidence for benefits from increased registered nurse staffing, mixed evidence showing both benefits and harms from adding other grades of staff to the nursing team is harder to interpret. While it seems possible that such staff may make some contribution to patient safety, the evidence cannot be used to support substitution of registered nurses by other grades of staff.

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## Declaration of Competing Interest

The authors declare no competing interests.

## Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi. org/10.1016/j.ijnurstu.2022.104311.

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