Variation in hospital IOL rates

The final version of this paper was published in BMJ Open 2015; 5:e008755

# Variation in hospital rates of induction of labour: a population-based record linkage study

Authors:

Tanya Nippita lecturer,<sup>1,2,3</sup> Judy Trevena biostatistics trainee,<sup>1</sup> Jillian Patterson biostatistician,<sup>1,2</sup> Jane Ford principal research fellow,<sup>1,2</sup> Jonathan Morris professor,<sup>1,2</sup> Christine Roberts associate professor.<sup>1,2</sup>

# Affiliations:

- Clinical and Population Perinatal Health, Kolling Institute, Northern Sydney Local Health District, St Leonards, NSW 2065, Australia
- Sydney Medical School Northern, University of Sydney, St Leonards, NSW 2065, Australia.
- Department of Obstetrics and Gynaecology, Royal North Shore Hospital, Northern Sydney Local Health District, St Leonards, NSW 2065, Australia

# Corresponding author: Dr Tanya Nippita

Address: Clinical and Population Perinatal Health Research, Kolling Institute of Medical Research, Level 2, Building 52, Royal North Shore Hospital, St Leonards, NSW 2065, Australia

Email: <u>tanya.nippita@sydney.edu.au</u>

Telephone: (+612) 9462 9801 or (+614) 02 321 392

#### ABSTRACT

BACKGROUND: Understanding the extent of hospital heterogeneity in induction of labour (IOL) practices to identify areas of practice improvement may result in improved maternity outcomes. We examined inter-hospital variation in rates of IOL to identify potential targets to reduce high rates of practice variation.

METHODS: Population-based record linkage study of all births of ≥24 weeks gestation in 72 hospitals in New South Wales, Australia, 2010-2011. Births were categorized into 10 mutually exclusive groups, derived from the Robson caesarean section (CS) classification. These groups were categorised by parity, plurality, fetal presentation, prior CS and gestational age. Multilevel logistic regression was used to examine variation in hospital IOL rates by the groups, adjusted for differences in casemix.

RESULTS: The overall IOL rate was 26.7% (46,922 of 175,444 maternities were induced), ranging from 9.7%- 41.2% (interquartile range 21.8%- 29.8%) between hospitals. Nulliparous and multiparous women at 39-40 weeks gestation with a singleton cephalic birth were the greatest contributors to the overall IOL rate (23.5% and 20.2% of all IOL respectively), and had persisting high unexplained variation after adjustment for casemix (adjusted hospital IOL rates ranging from 11.8%- 44.9% and 7.1%- 40.5% respectively). In contrast, there was little variation in inter-hospital IOL rates among multiparous women with a singleton cephalic birth at  $\geq$ 41 weeks gestation, women with singleton non-cephalic pregnancies, and women with multifetal pregnancies.

CONCLUSION: Seven of the 10 groups showed high or moderate unexplained variation in inter-hospital IOL rates, most pronounced for women at 39-40 weeks gestation with a singleton cephalic birth. Outcomes associated with divergent practice require determination, which may guide strategies to reduce practice variation.

#### INTRODUCTION

Variations in clinical practice will occur to some degree, as patient populations vary and healthcare should be individualised. However, for many medical interventions including in obstetrics,<sup>1</sup> much of clinical practice variation is unexplained (i.e. not due to patient profiles, preferences, or medical science).<sup>2</sup> Unexplained clinical practice variation questions the appropriate use of scarce resources,<sup>3</sup> whether medical interventions are too few or too many, and whether healthcare provision is efficient or effective.<sup>45</sup>

Induction of labour (IOL) is a common obstetric intervention occuring in approximately a quarter of all births,<sup>6,7</sup> with rates of IOL over time increasing in developing and developed countries.<sup>8</sup> Large differences in overall IOL rates have been described between countries.<sup>9</sup> provinces<sup>10</sup> and hospitals.<sup>11,12</sup> However, only one small study has previously reported overall interhospital IOL rates adjusting for casemix factors<sup>12</sup> and another report described hospital IOL rates for women by parity.<sup>13</sup> Hospital populations differ in the proportions of women with factors (such as parity, prior caesarean section (CS), gestational age, number of fetuses, and fetal presentation) that play a substantial role in clinical management of pregnant women; for example most women who reach  $\geq$  41 weeks gestation are offered IOL, as perinatal outcomes are improved.<sup>14</sup> Analysis of variation in hospital IOL rates by these groups<sup>15</sup> allows an assessment of whether variation in an overall pattern of hospital IOL is observed across all these clinical meaningful groups in which decision making is expected to be similar. Hospitals may have high rates of IOL across all scenarios, suggesting inherent clinical attitudes towards offering IOL. Alternatively, the hospital IOL rate may be driven by the IOL rate of a particularly large group of women, eg nulliparous women at term. In this case, targeted intervention strategies may be implemented for these particular groups of women.

Therefore, the aim of the study was to describe variation in hospital IOL rates using a novel classification system of 10 risk-based 'induction groups', while adjusting for casemix and hospital factors.

### METHOD

#### Study population

The study population included pregnancies resulting in a birth of a live-born infant of  $\geq$ 24 weeks gestation in hospital in New South Wales (NSW) between 2010 and 2011. Multi-fetal pregnancies were treated as a single maternity. Hospitals were excluded if they did not have the capability to perform inductions (n=32), did not perform any inductions in the study period (n=29) or had fewer than 50 births per annum (n=24). Births were excluded if the birth record had missing data on the variables of interest (n=1330). Preterm births (births  $\leq$ 36 weeks gestation) were also excluded if they occurred at hospitals which lacked the service capability to manage preterm infants (570 births at 27 hospitals, 5.1% of all preterm births), as although they manage preterm births in emergency situations, they were unlikely to perform planned induction of labour for preterm pregnancies and would not contribute to the understanding of variation in IOL rates. The population was then classified into 10 risk based 'induction groups', categorised by parity, prior CS, gestational age, number of fetuses and fetal presentation<sup>15</sup> (Table 1).

## Data source and study variables

Data were obtained from the NSW Perinatal Data Collection, a legislated population-based dataset of all live births and stillbirths in NSW.<sup>16</sup> Records were linked longitudinally by the NSW Centre for Health Record Linkage (CHeReL)<sup>17</sup> to create obstetric histories (previous births and caesarean sections) for each woman in the study population. Information was also available on pregnancy, maternal and infant characteristics.<sup>18,19</sup> The primary outcome was the proportion of births at each hospital in which labour was induced within each induction group. In addition to the stratification factors, casemix factors available for adjustment were

infant size at birth (<10<sup>th</sup> centile: small for gestational age; 10<sup>th</sup>-90<sup>th</sup> centile: appropriate for gestational age; >90<sup>th</sup> centile: large for gestational age), as well as maternal age, country of birth, smoking status, diabetes (pre-existing or gestational diabetes), hypertension (including chronic, gestational hypertension and preeclampsia), and type of care (public care in a public hospital, private care in a public hospital or private care in a private hospital).

#### Statistical Analysis

Pregnancy and maternal characteristics were determined according to onset of labour (spontaneous labour, IOL or no labour in the case of prelabour caesarean section). Multilevel logistic regression models were used to examine between-hospital variation in induction rates within each of the ten induction groups, with hospitals as a random-intercept. These models account for both differences in volume and potential clustering of similar women within hospitals. Hospital-specific induction rates (with 95% confidence intervals) were obtained by converting the odds ratio for each hospital into a relative risk and multiplying it by the state rate.<sup>20</sup> For each group, the unadjusted and adjusted models of hospital induction rates were obtained. The proportion of variance among hospitals explained by adjusting for case-mix was calculated as the difference between the variance of the adjusted and unadjusted models, expressed as a proportion of the unadjusted model variance. To compare the extent of variation in hospital induction rates across groups, we calculated the percentage of hospitals in each group that were significantly different from the state average rate (i.e. the proportion of hospitals for which the 95% confidence interval of the adjusted induction rate did not cross the state average). We pre-defined cut-offs for variation as: high (>30%), medium (15-30%), or low (<15%) levels of variation. Statistical analysis was performed using SAS (version 9.3; SAS Institute, Cary, North Carolina).

#### RESULTS

In 2010 and 2011, there were 175,444 maternities at 72 hospitals. Of these 46,922 (26.7%) followed induction of labour. The overall induction rate at NSW hospitals ranged from 9.7% to 41.2% (IQR 21.8%-29.8%).

Pregnancy and maternal characteristics according to onset of labour are shown in Table 2. When compared to women with spontaneous or no labour, women receiving an induction of labour were more likely to be nulliparous, born in Australia, have hypertension or diabetes, or have a prolonged (>41 weeks gestation) pregnancy (Table 2). Women who did not experience labour (ie those that had prelabour CS) were older and more likely to receive private care than women being induced.

Most inductions were among women at 39-40 weeks gestation (without a prior CS) with a singleton cephalic pregnancy (23.5% and 20.2% of all inductions for nulliparous and multiparous women respectively; Table 1). Within the induction groups, induction rates were highest for women without a prior CS at 41 or more weeks gestation with a singleton cephalic pregnancy (58.7% and 48.7% for nulliparous and multiparous women respectively;Table 1) and lowest for women with non-cephalic presentations (4.7%) or a history of having a previous CS (5.1%).

There was marked variation between hospital IOL rates within the induction groups (Figure 1). Adjusting for case-mix considerably *reduced* the variation between hospitals for induction for multiparous women at 37-38 (Group 4, -30%) and 39-40 weeks (Group 5, -37%) and single non-cephalic presentations (Group 7, -43%) but only by a small proportion for nulliparous women at 37-38 (Group 1, -11%) and 39-40 weeks (Group 2, -1%) and multifetal pregnancies (Group 10, -6%) (Table 1). In contrast, adjusting for case-mix slightly *increased* the between-hospital variance in inductions for nulliparous women at 41 or more weeks (Group 3, +6%; Table 1).

After accounting for case-mix, high unexplained variation in hospital induction rates persisted for nulliparous and multiparous women at 39-40 weeks with a singleton cephalic pregnancy

(Groups 2 and 5) and for women with at least one previous Caesarean Section (Table 1). There was low variation in induction rates between hospitals for multiparous women at 41+ weeks with a singleton cephalic pregnancy (Group 6, 14%), single non-cephalic presentations (Group 9, 3%) and multi-fetal pregnancies (Group 10, 9%): few hospitals had induction rates for these women that were significantly different from the overall average (Figure 1).

#### DISCUSSION

#### Principal Findings

In 2010-2011, just over one quarter of all births in our study population followed an IOL (26.7%), with considerable variation in hospital IOL rates, despite accounting for case-mix. Seven of the ten groups had medium to high variation in hospital IOL rates (nulliparous and multiparous women at 37-38 weeks gestation and 39-40 weeks gestation, nulliparous women  $\geq$ 41 weeks gestation, women with a prior CS and women  $\leq$ 36 weeks gestation). The greatest between hospital variation in IOL rates occurred in the two largest groups (Group 2 and Group 5)—women with a singleton cephalic pregnancy at 39-40 weeks gestation—and accounted for 43.7% of all inductions. Only women with a singleton, non-cephalic presenting fetus, women with a multifetal pregnancy and multiparous women with a singleton, cephalic fetus at  $\geq$ 41 weeks gestation had low between-hospital IOL rate variation, suggesting uniform clinical management across the hospitals for these groups of women.

#### Strengths and weaknesses of the study

The strengths of this study were the use of large, contemporary, longitudinally linked, population-based data and the use of availability of reliably collected labour and birth information. This enabled the application of a totally inclusive yet mutually exclusive classification system for IOL<sup>15</sup> allowing for similar pregnancies to be compared. Multilevel modelling was used to reduce the effect of random fluctuations in rates of IOL in low volume hospitals and allowed quantification of the contribution of casemix factors to the variation in

hospital IOL rates, while also accounting for similarities of births within hospitals. However, administrative data do not allow exploration of clinical variation in thresholds; indication for and methods of labour induction; physician and patient attitudes; or cultural influences on decision-making. Individual and hospital factors not accounted for in the model could contribute to increased variation between hospital IOL rates. Whilst this study focused on understanding the variation in hospital IOL rates for different clinical groups, differences in hospital IOL rates and outcomes (including mode of delivery, maternal and perinatal morbidity and mortality) needs to be explored to further guide practices to improve clinical care.

#### Interpretation

Practice variation has been related to medical uncertainty about the indications for and the efficacy of procedures.<sup>21</sup> There is much evidence showing the importance of clinical opinion in influencing rates of procedures, which can also be altered by feedback and review.<sup>22</sup> For example, in Wennberg's seminal work showing wide variations in rates of tonsillectomy in the state of Vermont, there was rapid decline in rates of tonsillectomy after feedback of data to clinicians.<sup>23</sup> The current study demonstrates considerable variation in hospital rates of IOL and is the first step in attempting to reduce unexplained variation.

The large variation in hospital IOL rates were for women at 39-40 weeks gestation with a singleton cephalic pregnancy may indicate heterogeneity in thresholds for clinicians to recommend induction of labour as the patient has now reached 'full term'. Such practice is, for example, indirectly endorsed by the American College of Obstetrics and Gynaecology Committee Opinion for 'nonmedically indicated early term delivery',<sup>24</sup> advising that non-medically indicated deliveries <39 weeks is not justified. This implies that once the parturient has reached 39 weeks, nonmedically indicated full term delivery may be justified. Additionally, the variation may be driven by differences in clinical practice attributable to recent studies regarding the effects of IOL and a reduction in the risks of caesarean section,<sup>25</sup> or some other unmeasured clinician or patient factor.

Variation in hospital IOL rates

Among nulliparae, not only did hospital rates of IOL at full term have large variation, but also moderate variation was seen in hospital rates of IOL women at early term (29% of hospitals different from the average). A report from the Royal College of Obstetricians and Gynaecologists found large variation in adjusted hospital IOL rates for nulliparae ≥37 weeks gestation, with 45% of hospitals having IOL rates significantly different compared to the average.<sup>13</sup> Our study found that only a small proportion of the variation in hospital IOL rates for nulliparae were explained by casemix (11% and 1% for Groups 1 and 2 respectively), suggesting that other factors affect IOL in this group. Further investigation of these factors affecting IOL for nulliparae are recommend as nulliparae at early and full term make up one third of all inductions; the proportion of nulliparae at early and full term being induced is increasing;<sup>26</sup> and there appears to be large unexplained variation in intrapartum caesarean section rates following IOL for nulliparae.<sup>27</sup> The importance of the first birth cannot be underestimated as it influences all subsequent births, and thus this large variation suggests that alternatives to a high IOL rate are achievable, and further investigation of variation in hospital IOL rates and the pregnancy outcomes for these groups is warranted.

There was also large variation in hospital rates of IOL for women with a prior CS and a singleton cephalic fetus, with 35% of hospitals different from the average. However, only a small proportion of these women had an IOL (5.1% of the group), which may reflect concerns about adverse outcomes such as uterine rupture. The Royal Australian and New Zealand College of Obstetricians and Gynaecologists statement suggests that IOL should be 'undertaken with caution'.<sup>28</sup> In contrast, other international guidelines, (UK, USA and Canada) state that IOL is 'appropriate' for these women and these countries have a higher proportion of women with a prior CS undergoing an IOL.<sup>29</sup>

There was low to moderate variation in hospital IOL rates for women  $\ge$  41 weeks gestation. There are many international guidelines recommending IOL for women  $\ge$  41 weeks gestation,<sup>30-32</sup> to reduce perinatal morbidity with no increase in the CS, based on evidence from a Cochrane review based on 22 randomised controlled trials.<sup>14</sup> For women in this

gestational age group, there is clearer evidence regarding the management of this clinical scenario, which is reflected in less variation in hospital IOL rates.

The observed variation in hospital IOL rates is more extensive than the reported between hospital variation in CS rates (ie there are more hospitals where the rate of IOL is significantly different from the state average IOL rates compared to the number of hospitals where the rate of caesarean section is significantly different).<sup>33 34</sup> Different practice styles and clinical decision making around obstetric intervention have been postulated in other studies as being related to overall hospital IOL<sup>11</sup> and CS rate variation.<sup>33 34</sup>

## Unanswered questions and future research

Variations in clinical practice are a form of a natural experiment, with outcomes and rates a result of small groups of health care professionals.<sup>23 35</sup> It is problematic to specify the correct or target intervention rate such as a hospital IOL rate, particularly when the appropriate rate is likely to differ according to the 'induction group'. Instead, the focus should be on achieving the best outcomes (such as the rate of intrapartum caesarean section, post partum haemorrhage, maternal and perinatal morbidity) for mothers and babies with minimum intervention,<sup>1</sup> reflecting improved clinical decision making, but also efficient resource management. Hospitals that have lower rates of IOL, yet have the same outcomes for mothers and babies compared to hospitals with higher rates of IOL, provide opportunities to suggest changes in clinical practice for other institutions. Conversely, if hospitals with low rates of obstetric intervention such as IOL are associated with worse outcomes for mothers and babies, then interventions should increase to improve pregnancy outcomes. Further investigation into the pregnancy outcomes of the IOL groups that show large variation (such as those women at 39-40 weeks gestation) may be able to identify hospitals that have differing rates of IOL, yet the same pregnancy outcomes. In particular, hospitals with minimum intervention and yet the same outcomes may be studied to examine areas of clinical practice management that differ from other hospitals.

#### CONCLUSION

Considerable variation in hospital IOL rates persisted after accounting for casemix. In particular, hospital IOL rates for women at 39-40 weeks gestation with a singleton cephalic birth showed high, unexplained variation, especially for nulliparous women. Further determination of outcomes associated with divergent IOL practice is required, which may guide strategies to reduce practice variation.

## ACKNOWLEDGEMENTS

We thank the New South Wales Ministry of Health for access to the population health data and the Centre for Health Record Linkage (CheReL) for linkage of the data sets.

## COMPETING INTERESTS STATEMENT

Competing interests: All authors have completed the ICMJE uniform disclosure form at <a href="http://www.icmje.org/coi\_disclosure.pdf">http://www.icmje.org/coi\_disclosure.pdf</a> and declare: no support from any organisation for the submitted work; no financial relationships with any organisations that might have an interest in the submitted work in the previous three years; no other relationships or activities that could appear to have influenced the submitted work.

## CONTRIBUTION TO AUTHORSHIP

CR and JM conceived the study. JT undertook data preparation and provided statistical analysis, with JP providing statistical oversight. TN, JT, JP, JF, CR and JM had full access to all of the data (including statistical reports and tables) in the study, take responsibility for the integrity of the data and the accuracy of the data analysis, took part in interpretation of results, drafting the manuscript, approve and take responsibility for the final manuscript.

# TRANSPARENCY DECLARATION

The lead author (TN) affirms that the manuscript is an honest, accurate, and transparent account of the study being reported; that no important aspects of the study have been omitted; and that any discrepancies from the study as planned have been explained.

## COPYRIGHT

The corresponding author (TN) has the right to grant on behalf of all authors and does grant on behalf of all authors, an exclusive licence (or non exclusive for government employees) on a worldwide basis to the BMJ Publishing Group Ltd to permit this article (if accepted) to be published in BMJ editions and any other BMJPGL products and sublicences such use and exploit all subsidiary rights, as set out in our licence.

## DATA SHARING

Data are not available for sharing.

## ETHICAL APPROVAL

Ethical approval was obtained from the NSW Population and Health Services Research Ethics Committee (Reference No. 2012-12-430).

## FUNDING

CR is supported by an NHMRC Senior Research Fellowship (APP1021025) and JF by an Australian Research Council Future Fellowship (FT120100069). JT was employed by the NSW Ministry of Health on the NSW Biostatistical Officer Training Program at the time this work was conducted. The funding sources had no involvement in the study design; collection, analysis, and interpretation of the data; or the decision to submit this paper for publication.

Table 1: Rates of induction and measures of between-hospital variation, separately for 10 induction groups, NSW, 2010-2011.

								% of
		Relative					% of	hospitals
		size of		% of	Inductions	Inductions	variance	different
		group	Inductions	group	as % of all	as % of all	explained	from
Induction Group <sup>15</sup>	Births (n)	(%)	(n)	induced	inductions	births	by case-mix	average <sup>1</sup>
1) Nulliparous, 37-38 weeks gestation, singleton cephalic fetus	14,467	8.2	4,823	33.3	10.3	2.7	11	29
2) Nulliparous, 39-40 weeks gestation, singleton cephalic fetus	39,454	22.5	11,004	27.9	23.5	6.3	1	58
<ol> <li>Nulliparous, ≥41 weeks gestation, singleton cephalic fetus</li> </ol>	14,124	8.1	8,291	58.7	17.7	4.7	-6	21
4) Multiparous, no previous CS, 37-38 weeks gestation, singleton cephalic fetus	15,323	8.7	5,075	33.1	10.8	2.9	30	28
5) Multiparous, no previous CS, 39-40 weeks gestation, singleton cephalic fetus	40,527	23.1	9,465	23.4	20.2	5.4	37	49
6) Multiparous, no previous CS, ≥41 weeks gestation, singleton cephalic fetus	9,538	5.4	4,643	48.7	9.9	2.6	11	14
7) No previous CS, ≤36 weeks, singleton cephalic fetus	6,721	3.8	1,396	20.8	3.0	0.8	20	17
8) Previous CS, singleton cephalic fetus	26,174	14.9	1,335	5.1	2.8	0.8	15	35
9) Singleton, non-cephalic fetus	6,524	3.7	307	4.7	0.7	0.2	43	3
10) Multi-fetal pregnancy	2,592	1.5	583	22.5	1.2	0.3	6	9
Total	175,444	100.0	46,922		100.0	26.7		

<sup>1</sup>proportion of hospitals for which the 95% confidence interval of the adjusted hospital induction rate does not cross the crude state average

Table 2: Maternal and pregnancy characteristics by onset of labour, NSW, 2010-2011

		Spontaneous	Induction	No labour	Total
		n = 96,335	n = 46,922	n = 32,187	n = 175,444
		n (%)	n (%)	n (%)	n (%)
Maternal Characteristics					
Age (years)	< 20	3,821 (4.0)	1,641 (3.5)	314 (1.0)	5,776 (3.3)
	20-34	73,171 (76.0)	34,508 (73.5)	19,973 (62.1)	127,652 (72.8)
	≥ 35	19,343 (20.1)	10,773 (23.0)	11,900 (37.0)	42,016 (23.9)
Born in Australia		62,878 (65.3)	32,951 (70.2)	21,744 (67.6)	117,573 (67.0)
Smoking during pregnancy		11,789 (12.2)	5,007 (10.7)	2,764 (8.6)	19,560 (11.1)
Diabetes		4,196 (4.4)	4,824 (10.3)	2,911 (9.0)	11,931 (6.8)
Hypertension		1,792 (1.9)	5,864 (12.5)	2,133 (6.6)	9,789 (5.6)
Type of care	Private, private hospital	17,901 (18.6)	11,422 (24.3)	11,703 (36.4)	41,026 (23.4)
	Private, public hospital	6,658 (6.9)	4,338 (9.3)	3,926 (12.2)	14,922 (8.5)
	Public, public hospital	71,776 (74.5)	31,162 (66.4)	16,558 (51.4)	119,496 (68.1)

Pregnancy Characteristics

Variation in hospital IOL rates

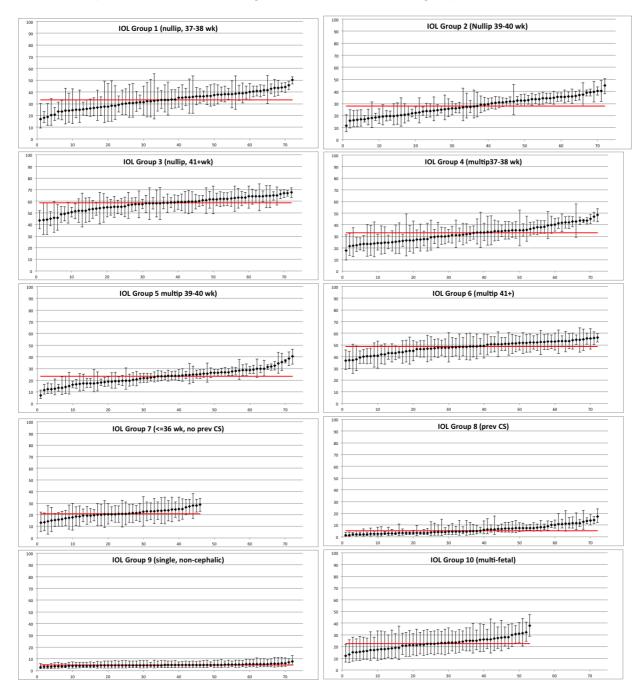
Nulliparity		42,340 (44.0)	25,242 (53.8)	9,022 (28.0)	76,604 (43.7)
Previous Ceasarean					
(multiparous only)		7,535 (14.0)	1,359 (6.3)	18,859 (81.4)	27,753 (28.1)
Singleton		95,519 (99.2)	46,339 (98.8)	30,994 (96.3)	172,852 (98.5)
Cephalic presentation		94,449 (98.0)	46,603 (99.3)	27,389 (85.1)	168,441 (96.0)
Gestational age	≤ 36 weeks	5,609 (5.8)	1,610 (3.4)	3,349 (10.4)	10,568 (6.0)
	37-40 weeks	79,787 (82.8)	31,884 (68.0)	27,943 (86.8)	139,614 (79.6)
	≥ 41 weeks	10,939 (11.4)	13,428 (28.6)	895 (2.8)	25,262 (14.4)
Infant size	SGA <sup>1</sup> (<10%ile)	8,759 (9.1)	5,259 (11.2)	2,834 (8.8)	16,852 (9.6)
	LGA <sup>2</sup> (>90%ile)	8,513 (8.8)	4,894 (10.4)	4,476 (13.9)	17,883 (10.2)

<sup>1</sup> Small for gestational age

<sup>2</sup> Large for gestational age

Figure 1: Adjusted hospital-specific induction rates, separately for each induction group, NSW, 2010-2011.

\*Red line represents the state average rate for each induction group



#### References

- 1. Glantz JC. Obstetric Variation, Intervention, and Outcomes: Doing More but Accomplishing Less. Birth 2012;39(4):286-90.
- 2. Corallo AN, Croxford R, Goodman DC, et al. A systematic review of medical practice variation in OECD countries. Health Policy 2014;114(1):5-14.
- 3. Mulley AG. Improving productivity in the NHS. BMJ 2010;341:c3965.
- 4. Wennberg JE. Time to tackle unwarranted variations in practice. BMJ 2011;342:d1513.
- 5. Ham C. Doctors must lead efforts to reduce waste and variation in practice. BMJ 2013;346:f3668.
- Li Z, Zeki R, Hilder L, et al. Australia's mothers and babies 2011. Perinatal statistics series no. 28. Cat. no. PER 59. Canberra: AIHW National Perinatal Epidemiology and Statistics Unit, 2013.
- 7. HES. NHS maternity statistics 2011-12 summary report: The Health and Social Care Information Centre, 2012.
- Vogel JP, Betran AP, Vindevoghel N, et al. Use of the Robson classification to assess caesarean section trends in 21 countries: a secondary analysis of two WHO multicountry surveys. Lancet Glob Health 2015;3(5):e260-70.
- 9. EURO-PERISTAT Project with SCPE and EUROCAT. European Perinatal Health Report. The health and care of pregnant women and babies in Europe in 2010. May 2013.
- Lutomski JE, Morrison JJ, Lydon-Rochelle MT. Regional variation in obstetrical intervention for hospital birth in the Republic of Ireland, 2005–2009. BMC Pregnancy Childbirth 2012;12.
- 11. Glantz JC. Rates of labor induction and primary cesarean delivery do not correlate with rates of adverse neonatal outcome in level I hospitals. J Matern Fetal Neonatal Med 2011;24(4):636-42.
- Glantz JC, Guzick DS. Can differences in labor induction rates be explained by case mix? J Reprod Med 2004;49(3):175-81.

- RCOG. Patterns of Maternity Care in English NHS Hospitals 2011/12. London, United Kingdom: Royal College of Obstetricians and Gynaecologists, 2013.
- Gulmezoglu AM, Crowther CA, Middleton P. Induction of labour for improving birth outcomes for women at or beyond term. Cochrane Database of Systematic Reviews 2009;(4)(CD004945).
- 15. Nippita TA, Khambalia A, Seeho SK, et al. Methods of classification for women undergoing induction of labour: a systematic review and novel classification system. BJOG 2015;in press.
- Demand and Performance Evaluation Branch, Centre for Epidemiology and Research.
   New South Wales Perinatal Data Collection: NSW Department of Health, 2011.
- Centre for Health Record Linkage. CHeReL- Quality Assurance. 2011.
   http://www.cherel.org.au/quality-assurance. [Accessed 1st May, 2014]
- Roberts CL, Bell JC, Ford JB, et al. Monitoring the quality of maternity care: how well are labour and delivery events reported in population health data? Paediatr Perinat Epidemiol 2009;23(2):144-52.
- Taylor LK, Pym M, Bajuk B, et al. Validation study: NSW Midwives Data Collection 1998.
   NSW Department of Health, 2000.
- 20. Mohammed MA, Manktelow BN, Hofer TP. Comparison of four methods for deriving hospital standardised mortality ratios from a single hierarchical logistic regression model. Stat Methods Med Res 2012 Nov 6 [epub ahead of print].
- 21. Wennberg JE. Forty years of unwarranted variation--and still counting. Health Policy 2014;114(1):1-2.
- 22. Ivers NM, Grimshaw JM, Jamtvedt G, et al. Growing literature, stagnant science? Systematic review, meta-regression and cumulative analysis of audit and feedback interventions in health care. J Gen Intern Med 2014;29(11):1534-41.
- 23. Wennberg JE, Blowers L, Parker R, et al. Changes in tonsillectomy rates associated with feedback and review. Pediatrics 1977;59(6):821-6.

- 24. ACOG Committee Opinion no. 561: Nonmedically indicated early-term deliveries. Obstet Gynecol 2013;121(4):911-5.
- 25. Wood S, Cooper S, Ross S. Does induction of labour increase the risk of caesarean section? A systematic review and meta-analysis of trials in women with intact membranes. BJOG 2014;121(6):674-85.
- 26. Patterson JA, Roberts CL, Ford JB, et al. Trends and outcomes of induction of labour among nullipara at term. Aust N Z J Obstet Gynaecol 2011;51(6):510-7.
- 27. Nippita T, Lee Y, Patterson J, et al. Variation in hospital caesarean section rates and obstetric outcomes among nulliparae at term: a population-based cohort study.
   BJOG 2015;122(5):702-11.
- Royal Australian and New Zealand College of Obstetricians and Gynaecologists. College Statement (C-Obs 38) Planned vaginal birth after caesarean section (trial of labour), 2010.
- Hill JB, Ammons A, Chauhan SP. Vaginal birth after cesarean delivery: comparison of ACOG practice bulletin with other national guidelines. Clin Obstet Gynecol 2012;55(4):969-77.
- 30. WHO. WHO recommendations for induction of labour. Geneva, Switzerland: WHO Press, 2011.
- 31. National Collaborating Centre for Women's and Children's Health. Induction of labour. National Institute for Health and Clinical Excellence Guidelines. London: RCOG Press, 2008.
- 32. Practice bulletin No.146: Management of late-term and postterm pregnancies. Obstet Gynecol 2014;124(2 Pt 1):390-6.
- Lee YY, Roberts CL, Patterson JA, et al. Unexplained variation in hospital caesarean section rates. Med J Aust 2013;199(5):348-53.
- 34. Brennan DJ, Robson MS, Murphy M, et al. Comparative analysis of international cesarean delivery rates using 10-group classification identifies significant variation in spontaneous labor. Am J Obstet Gynecol 2009;201(3):308.e1-08.e8.

35. Lee SK, McMillan DD, Ohlsson A, et al. Variations in practice and outcomes in the Canadian NICU network: 1996-1997. Pediatrics 2000;106(5):1070-9.