

Research Article

# Prediction of glomerular filtration rate maturation across preterm and term neonates and young infants using inulin as marker

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Abstract. Describing glomerular filtration rate (GFR) maturation across the heterogeneous population of preterm and term neonates and infants is important to predict the clearance of renally cleared drugs. This study aims to describe the GFR maturation in (pre)term neonates and young infants (PNA < 90 days) using individual inulin clearance data ( $CL_{inulin}$ ). To this end, published GFR maturation models were evaluated by comparing their predicted GFR with CL<sub>inulin</sub> retrieved from literature. The best model was subsequently optimized in NONMEM V7.4.3 to better fit the CL<sub>inulin</sub> values. Our study evaluated seven models and collected 381 individual CL<sub>inulin</sub> values from 333 subjects with median (range) birthweight (BWb) 1880 g (580-4950), gestational age (GA) 34 weeks (25-43), current weight (CW) 1890 g (480-6200), postnatal age (PNA) 3 days (0-75), and CL<sub>inulin</sub> 2.20 ml/min (0.43-17.90). The De Cock 2014 model (covariates: BWb and PNA) performed the best in predicting CL<sub>inulin</sub>, followed by the Rhodin 2009 model (covariates: CW and postmenstrual age). The final optimized model shows that GFR at birth is determined by BWb, thereafter the maturation rate of GFR is dependent on PNA and GA, with a higher GA showing an overall faster maturation. To conclude, using individual CL<sub>inulin</sub> data, we found that a model for neonatal GFR requires a distinction between prenatal maturation quantified by BWb and postnatal maturation. To capture postnatal GFR maturation in (pre)term neonates and young infants, we developed an optimized model in which PNA-related maturation was dependent on GA.

**KEY WORDS:** Glomerular filtration rate; Inulin; Maturation; Neonates; Preterm.

# INTRODUCTION

Glomerular filtration rate (GFR) in neonates plays an important role in the clearance of drugs primarily eliminated via the kidneys. Characterizing its maturation provides a better understanding of renal function development and is helpful for the first dose selection of renally cleared drugs.

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GFR in neonates can be assessed using endogenous or exogenous markers (1-8). Among them, creatinine is the most widely used, although it is less accurate during the first days of life when its concentration reflects maternal levels (9). Moreover, creatinine undergoes passive reabsorption in the renal tubule in early infancy (10, 11). With regard to exogenous markers, inulin clearance (CL<sub>inulin</sub>) is the gold standard for GFR measurement, as it is solely excreted by glomerular filtration, not resorbed, and not secreted by renal tubular cells, yet its use is associated with considerable burden and practical issues (12, 13). Other exogenous markers like iohexol, <sup>51</sup>Cr-EDTA, and iothalamate have been evaluated in adults (14) and closely approximate inulin clearance. However, such data are limited in neonates (15, 16). Another way to determine GFR is by quantifying the clearance of drugs that are almost exclusively renally filtered. One example for this approach has been the clearance of aminoglycosides (4, 5, 17, 18). However, as aminoglycosides themselves are potentially nephrotoxic and they are mainly used in neonates with (suspected) infections, they may not represent the GFR function in non-infected neonates.

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In normal pregnancies, nephrogenesis starts from the 6th week of gestation and is normally completed by 36 weeks of gestation (19). The number of nephrons at birth increases with increasing birthweight (BWb) and gestational age (GA) (20, 21). Birth introduces a transition from intrauterine to extrauterine environment, characterized by an increase in cardiac output, renal blood flow, and arterial blood pressure, and decrease in renal vascular resistance, leading to a rapid increase in GFR within the first two weeks of life (22, 23).

Many models have been built to characterize developmental changes for GFR. The model of De Cock *et al.* (4) was based solely on neonatal data and found that GFR maturation depends on both prenatal (BWb) and postnatal (PNA) covariates. Instead of focusing on the neonatal population alone, other models tried to describe the maturation throughout childhood, using one continuous function with covariates like current bodyweight (CW), postmenstrual age (PMA), and/or body surface area (BSA) (2, 3, 5, 6). Often, their models implicitly assume that prenatal and postnatal maturation follow the same pattern and ignore the impact of birth.

Recently, Salem *et al.* (1) published a GFR maturation model using inulin as marker, for individuals from 0 to 18 years of age in which the impact of both prenatal and postnatal maturation are explicitly quantified using GA, postnatal age (PNA) and CW. As a result, neonates with the same PMA show a different GFR depending on GA at birth. However, the use of their function did not result in unbiased predictions of clearance of different renally excreted drugs in preterm newborns.

With various models being published and only one model focusing on neonates, it is not clear which covariates and which functions best describe the heterogeneous pattern of GFR maturation especially in (pre)term neonates, as none of these models has been compared directly for their predictive performance of GFR in this population. This study aimed to compare the performance of available literature GFR maturation models in predicting GFR in (pre)term neonates and young infants (PNA < 90 days), using  $CL_{inulin}$  data as surrogate. As a second step, a new GFR maturation model was developed based on optimization of the best literature model that would better fit the observed  $CL_{inulin}$  data.

# **METHODS**

# Literature Search of Published GFR Maturation Models

A literature search was conducted to retrieve models that quantified GFR maturation in both preterm and term neonates and only used demographic characteristics like BWb, PNA, GA, CW, height, gender, and BSA as input. The literature search was conducted in PubMed using the search term "glomerular filtration maturation neonates."

# Literature Search of Inulin Clearance

Another literature search was conducted in PubMed for English studies reporting individual CL<sub>inulin</sub> in neonates and infants up to a PNA of 90 days. The reference lists of these papers were also screened for potentially relevant articles. The search terms and flow charts are provided in the Supplementary materials. Studies reporting individual plasma or renal inulin clearance after continuous infusion were included. Subjects with major congenital anomalies, reported renal disease, or with concomitant drugs known for renal toxicity were excluded. Individual CL<sub>inulin</sub> values and demographic information on BWb, PNA, GA, CW, height, gender, and BSA were extracted from included papers. The clinical conditions of subjects as reported in the original papers were also collected. When inulin clearance values were published in graphs, data points were digitalized using Graph Grabber V2.0 (Quintessa.org). Data cleaning and visualization were conducted in R 4.0.2 (CRAN.R-project.org).

To be included in the dataset, each patient should at least have reported PNA values and one of the following covariates: BWb, GA, or CW. When CW was missing while BWb and PNA were reported, CW was determined according to the CW growth curves versus PNA for neonates with different BWb (24, 25). These curves were also used to calculate BWb from CW and PNA. When BWb was available while GA was not, or vice versa, the revised Fenton growth chart describing the relationship between BWb and GA was used (26). If the papers published individual sex, the revised Fenton growth chart for boys or girls was used accordingly. Otherwise, sex was randomly assigned to each patient assuming a chance of 50% for each of them. If the generated demographic values exceeded the range reported in the paper, the relevant minimum or maximum value of that paper were used instead. Unless reported, height was imputed using the equations provided by Abduljalil et al. (Eq.1) (27), and missing BSA values were imputed using the Haycock equation (Eq. 2) (28).

Height (cm) =  $-43.205 \times PMA^2 + 111.84 \times PMA - 9.4871$  (1)

BSA 
$$(m^2) = CW^{0.5378} \times Height^{0.3964} \times 0.024265$$
 (2)

Where the BSA is the body surface area in square meters, CW is the current bodyweight in kilograms, height is in centimeters, and PMA is the postmenstrual age in years.

## **Model Comparison**

The predictive performance of the included GFR maturation models was examined by comparing their predicted GFR with the individual CL<sub>inulin</sub> values retrieved from literature (observed CL<sub>inulin</sub>). For this, percentage prediction error (%PE<sub>GFR</sub>) (Eq. 3) for each observation was calculated and plotted versus PNA to assess potential PNA-related bias of the prediction. Additionally, for predefined GA groups (< 28, 28–31, 32–36,  $\geq$  37 weeks), median %PE<sub>GFR</sub> and root mean square percentage prediction error (%RMSPE<sub>GFR</sub>) (Eq.4) were calculated to indicate the bias and precision, respectively, of the prediction by included models in different GA groups.

$$\% PE_{GFR} = \frac{\text{predicted GFR-observed CL}_{inulin}}{\text{observed CL}_{inulin}} \times 100$$
(3)

$$\% \text{RMSPE}_{\text{GFR}} = \sqrt{\left(\frac{1}{n}\right) \times \sum_{i=1}^{n} \left(\frac{\text{predicted GFR-observedCL}_{\text{inulin}}}{\text{observed CL}_{\text{inulin}}}\right)^2} \times 100$$
(4)

# **Model Optimization**

To get to an optimized description of GFR in neonates and young infants, inulin clearance data were modeled using NONMEM V7.4.3 (ICON Development Solutions, Ellicott City, MD, USA), supported by Per-speaks-NONMEM (PsN) 4.9.0, and interfaced by Pirana 2.9.9. Parameters were estimated using the first-order conditional estimation with interaction (FOCE+I) method.

The most accurate literature model was used as a basis for improvement by either re-estimating the parameters, replacing the original covariates with other correlated covariates, or including other demographic covariates (BWb, PNA, CW, PMA, BSA, height) on top of the base function. If a diagnosis was reported in more than 10 subjects, this diagnosis was tested separately as binary covariate for its influence on GFR. Inter-study and inter-individual variability were tested on model parameters and assumed to be lognormally distributed with the random variable (ETA) having a mean of zero and an estimated variance of  $\omega^2$ . Inter-study variability was tested as assays and the condition of the included subjects could vary between different literature studies. For the residual variability, an additive-error model on log-transformed data was used.

Model selection for hierarchical models was based on the objective function value (OFV). A drop of more than 3.84 in OFV (p < 0.05; degree of freedom = 1) based on likelihood ratio test was considered significant. For non-hierarchical models, the Akaike information criterion (AIC) was used (29). In addition, goodness-of-fit (GOF) plots were used for diagnostic purpose. Processing and visualization of output from NONMEM was performed in R 3.0.1 (CRAN.R-project.org). For model evaluation, visual predictive checks (VPCs) stratified for four GA groups (< 28, 28–31, 32–36,  $\geq$  37 weeks), based on 1000 simulations, were used.

The final optimized model was used to simulate typical GFR values versus PNA up to 60 days of five hypothetical neonates with BWb of 850, 1500, 2500, 3000, and 3600 g, corresponding to GA of 26.1, 30.6, 35.1, 37.3, 40.2 weeks for boys and 26.5, 31.1, 35.6, 37.7, 41 for girls based on the revised Fenton growth charts (26).

# RESULTS

#### Literature Search of Published GFR Maturation Models

In literature, we identified seven existing models (1–7) that described GFR maturation in both preterm and term neonates (Table I). Of all the included models, the De Cock 2014a (4) model was exclusively developed for the neonatal population, while the rest of the models covered the entire pediatric population.

The De Cock 2014a (4) model and the De Cock 2014b (5) model both used aminoglycoside clearance as marker for GFR. In both models, there is a fixed covariate function that describes the developmental

changes of drug clearance with covariates, and a drug specific parameter, CLp, estimated for each aminoglycoside. As it was not clear which aminoglycoside's clearance best represent GFR, in the current analysis, CLp values were taken either for amikacin (De Cock 2014a), gentamicin (De Cock 2014b), or were re-estimated using collected individual  $CL_{inulin}$ . Therefore, for both models, two CLp values were evaluated (Table I). The reestimation of CLp using inulin clearance was conducted in NONMEM as described in the Model optimization section using the structure of the covariate function given in Table I.

### Literature Search of Inulin Clearance

Data from 12 studies (30–41), reporting 381 CL<sub>inulin</sub> values from 333 patients were included in this analysis (Table II). Other than PNA, all covariates had missing values. BWb values were missing in 98 (26%) out of the 381 inulin clearance observations. For those missing BWb values, 83 were calculated from CW and PNA, and the remaining 15 observations for which CW were not available were calculated from GA. CW was missing in 211 (55%) observations, and were calculated from BWb and PNA. GA of 108 (28%) observations were missing and were generated from BWb. Both, the missing height (n = 300, 79%) and BSA values (n = 255, 67%) were calculated using the functions provided in the Methods. Sex was missing in most (n = 274, 72%) observations. The summary of the patients' characteristics after imputation is shown in Table III.

Of the 12 studies, six reported  $CL_{inulin}$  in ml/min, four (31, 33, 34, 40) reported  $CL_{inulin}$  in ml/min/1.73 m<sup>2</sup>, ml/min/m<sup>2</sup>, or ml/min/kg, in which case these values were converted into ml/min using the BSA or CW values provided in these studies. Two studies (38, 41) reported  $CL_{inulin}$  in a unit of ml/min/1.73 m<sup>2</sup> or ml/min/m<sup>2</sup> without providing BSA (37 observations). These  $CL_{inulin}$  observations were converted into ml/min using the BSA calculated by Eq. 2. Three studies (30, 33, 35) reported multiple measurements (2–4 times) of  $CL_{inulin}$  in the same subjects.

Except for one study (38) in which the clinical condition of subjects was not reported, none of the studies reported any renal disease in the included patients. Nine studies (30–33, 35–37, 39, 40) reported their patients to be either healthy or in stable condition at the time of study. Fifty patients were reported with a specific diagnosis (Table II).

Figure 1 displays the reported inulin clearance versus PNA for different GA groups on a linear scale (A) and on a log-log scale (B). The figure shows that inulin clearance at birth is higher for higher GA, and after birth inulin clearance increases with PNA with the rate being faster for neonates with higher GA. Above 25 days postnatal age, an increased maturation rate of GFR for GA < 32 weeks (green symbols) and a decreased maturation rate of GFR for GA > 37 weeks were observed (red symbols).

#### **Model Comparison**

Figure 2 displays the %PE<sub>GFR</sub> of the predictions by the included GFR maturation models versus PNA per GA group.

Model name	Markers	Included Functions population
Salem 2021 (1)	Inulin	$ \begin{array}{llllllllllllllllllllllllllllllllllll$
Johnson 2006 (2)	Inulin, Mannitol, <sup>51</sup> Cr-EDTA	Preterm Neonates $GFR(ml/min) = (-6.1604 \times BSA^2) + (99.054 \times BSA) - 17.74$ to patient up to 20
Rhodin 2009 (3)	Mannitol, Inulin, <sup>51</sup> Cr-EDTA, Iohexol, Sinietrin	Preterm neonates $GFR(ml/min) = (\frac{CW}{70})^{0.632} \times \frac{PMA^{3.38}}{554^{3.38} + PMA^{3.38}} \times 112$ to adults of 31 years
De Cock 2014a (4) De Cock 2014b (5)	Amikacin Gentamicin,	Preterm and term GFR $(L/h) = CLp^* \times (\frac{BWB}{1.750})^{1.34} \times (1 + (0.213 \times \frac{PMA}{2}))$ neonates Preterm neonates GFR $(L/h) = CLp^{**} \times (\frac{CW}{4kg})^{BDEi}$ and $BDEi = 2.23 \times CW^{-0.065}$
20140 (5) Mahmood 2016 (6) Anderson 2018 (7)	vancomycin vancomycin Inulin Mannitol, Inulin, <sup>51</sup> Cr-EDTA, Iohexol, Sinistrin	Preterm neonates GFR(ml/min) = $\left(\frac{\text{CW}}{70}\right)^b \times 120$ b = 1.15 for preterm and 1 for term neonates to adults Premature to adults GFR(ml/min) = $\left(\frac{\text{CW}}{70}\right)^{0.75} \times \frac{1}{1+\left(\frac{\text{CW}}{338}\right)^{-3.45}} \times \frac{1+0.583 \times (1-e^{-\text{PNA} \times 402/6.77})}{1+0.583} \times 116$ of 31 years
* CIn of an	ilini (0.040) and initi	(100766) were both need for commarison

"CLp of amikacin (0.049) and inulin (0.0766) were both used for comparison "CLp of gentamicin (0.21) and inulin (0.684) were both used for comparison *BWb* birthweight in kilograms, *BSA* body surface area in square meters, *CW* current bodyweight in kilograms, *GA* gestational age in weeks, *GFR* glomerular filtration rate, *PMA* postmenstrual age in weeks, *PNA* postnatal age in days unless specified

Table I Overview of GFR Maturation Models Retrieved From Literature

Study	Patient number	GA (weeks) (range)	BWb (kg) (range)	PNA (days) (range)	CW (kg) (range)	Reported clinical conditions	GFR units
Coulthard er al 1985 (30)	39	26-40	0.68-3.71	2-63	NA (0.55- 3 74)	Healthy	ml/min
Oh et al., 1966 (31)	67	NA (38-	2.87-4.7	0-5	2.6-4.7	In good condition	ml/min/1.73 m <sup>2</sup>
Leake et al., 1977 (32)	38	42) 27-43	0.58–3.74	0–3	NA (0.55– 3.74)	All were healthy except three with mild meconium aspiration and two with mild RDS. None required ventilatory assistance.	ml/min
Leake et al., 1976 (33)	36	25-42	NA (0.6– 2.82)	2–63	NA (0.49– 3.06)	Healthy and AGA	ml/min and ml/min/ 1.73 m <sup>2</sup>
Guignard <i>et al.</i> , 1975 (34)	22	NA (32- 40)	NA (1.8- 4.95)	1–25	1.38–5.38	No evidence of cardiopulmonary or renal disturbance. Some were diagnosed with prematurity, hyperbilirubinemia, and intranterine growth retardation	ml/min/m2 and ml/ min/kg
van der Heijden, 1988 (35)	41	27–36	0.81–2.74	3-11	NA (0.65– 2.68)	In a statement condition at the time of study. Some were diagnosed with RDS, PDA <i>etc.</i> 15 patients were machanically variated	ml/min
Robinson, D. 1990 (36)	13	30-41	0.90–3.35	$^{\prime}$	NA (0.87– 3 33)	incommony volumed Clinically stable (7 were growth-retarded neonates and 6 were control neonates)	ml/min
Hansen, N. B. 1983	15	27–32	NA (0.90-	1	NA (0.85-	AGA, no renal abnormalities	ml/min
Broberger, U. 1973	15	NA (36-	2.5–3.7	3-14	NA (2.41- 3.75)	11 subjects were after 4-hour fasting; 4 were within 1 hour	$ml/min/1.73 m^2$
Brodehl, J. 1968	10	<sup>41</sup> ) NA (37–	NA (2.38- 3.68)	16-75	2.7–6.2	or recurse Healthy, without any symptoms of metabolic or renal diseases	$ml/min/1.73 m^2$
(40) Barnett, H. L. 1948 (30)	15	41) NA (28- 35)	0.96–2.47	3–73	2.13–2.47	17 well female premature infants	ml/min
Fawer, CL 1979 (41) <sup>b</sup>	22	28–43	NA (1.24- 3.52)	1–3	1.1–3.5	Some were diagnosed with prematurity, hyperbilirubinemia, and intrauterine growth retardation	ml/min/m <sup>2</sup>
NA indicates that th <sup>a</sup> Only control group <sup>b</sup> Only the subjects th AGA appropriate fo ductus arteriosus, $RI$	e individu with mea 1at were 1 r gestatio OS respira	ial values we asurements p not included nal age, <i>BW</i> itory distress	ere not report performed at ( in Guignard <i>b</i> birthweight syndrome	ted. The r day 1 was <i>et al.</i> 197: t, <i>CW</i> cur	number in the s included 5 were includ rrent bodywei	bracket below NA shows the range of imputed characteristics d ght, $CL_{inulin}$ inulin clearance, $GA$ gestational age, $GFR$ glomerular filtration rate, $PNA$ postne	ttal age, <i>PDA</i> patent

Table II Overview of the Included Studies Reporting on Individual Inulin Clearance

Table III	Summary of the Characteristics of Patients (	n = 333) to
	Which Inulin Clearance* was Reported	

Patient characteristics	Median (range)
Birthweight (kg)	1.88 (0.58-4.95)
Gestational age (weeks)	34.0 (25.0–43.0)
Current bodyweight (kg)	1.89 (0.48-6.20)
Postnatal age (days)	3.0 (0-75.0)
Bodyweight surface area (m <sup>2</sup> )	0.15 (0.06–0.29)
Inulin clearance (ml/min)	2.20 (0.43-17.90)

\*For detailed information of studies in which inulin clearance was extracted, see Table II

Table IV presents the  $\[Mmm] RMSPE_{GFR}$  and median  $\[Mmm] PE_{GFR}$  per GA group.

As indicated by Fig. 2 and Table IV, the De Cock 2014a model (4) with CLp estimated for inulin had the best predictive performance, followed by the Rhodin 2009 model (3). The De Cock 2014a (inulin-CLp) model generally showed an unbiased prediction of CL<sub>inulin</sub> across PNA and GA, although there was a slight over-prediction for neonates with GA < 28 weeks and PNA > 10 days. Although with similar %RMSPE<sub>GFR</sub>, the Rhodin 2009 model (3) generally showed under-prediction for neonates with GA < 28 weeks and a downward trend of %PE<sub>GFR</sub> with increasing PNA for GA  $\geq$  28 weeks.

Compared to the models that use CLp of inulin, both the De Cock 2014a (4), using CLp of amikacin, and the De Cock 2014b (5), using CLp of gentamicin, underestimated CLinulin and thus have negative  $\text{%PE}_{GFR}$  values across GA groups. This is also confirmed by the fact that the CLp values estimated using CL<sub>inulin</sub> for De Cock 2014a (4) model (0.0766 L/h) and De Cock 2014b (5) (0.684 L/h), were higher than that of amikacin (0.049 L/h) and gentamicin (0.21 L/h), respectively.

The Mahmood 2016 model (6) showed almost the same trend of  $\text{\%PE}_{\text{GFR}}$  with PNA as the Rhodin 2009 model (3), although the Mahmood 2016 model (6) had a worse prediction for term neonates. PNA-related bias was less in the Anderson 2018 model (7) compared to the Rhodin 2009

model (3), yet with generally higher  $\text{\%PE}_{GFR}$  and  $\text{\%RMSPE}_{GFR}$ . The Salem 2021 model (1) and Johnson 2006 model (2) predicted adequately in term neonates, but with an obvious bias in preterm neonates.

## **Model Optimization**

Based on the model comparison results, the De Cock 2014a (4) model using CLp for inulin was used as basis to develop the final optimized GFR maturation model for neonates and young infants. In the De Cock 2014a (4) model, GFR at birth was best described by BWb, and postnatal maturation by PNA in a linear function. After fitting to the inulin clearance data, a power function instead of linear function was found to best describe the postnatal GFR development. In addition, GA was included in the function to characterize both the steepness and shape of that PNA-related GFR development (Table V). These changes led to a reduction of OFV of 70 and AIC of 64 compared to the De Cock 2014a (4) model with inulin CLp. Replacing GA with BWb to describe the PNA-based GFR maturation after birth did not lead to an equal or better fit. An impact of patients' diagnosis could neither be identified with statistical significance, probably due to the lack of data on diagnosis. Inter-patient and inter-study variability were included on CLp. This optimized model was selected as final model and called the final optimized model. The final parameter estimates are listed in Table V.

The diagnostic plots for the final optimized model are provided in Fig. 3. It can be seen that the optimized model improves the over-prediction of the De Cock 2014a (inulin-CLp) model for neonates < 28 weeks GA. The VPC of the final optimized model (Fig. S1) shows generally good agreement between the observed data and the simulated confidence intervals for the medians and the 2.5th and 97.5th percentiles for all GA groups.

Figure 4 illustrates the GFR maturation predicted by the final optimized model in typical neonates with different combinations of BWb and the corresponding GA. Shortly after birth, the GFR of these neonates is determined by BWb (*i.e.*, for BWb of 850 g, 1500 g, and 3000 g, the initial inulin clearance at



Fig. 1 Collected inulin clearance values (30-41) versus postnatal age (PNA) grouped by color for different gestational age (GA) groups on linear (A) or on log-log scale (B)





**Fig. 2** Percentage prediction error (%PE<sub>GFR</sub>) of the glomerular filtration rate (GFR) predictions by seven published models (1–7) versus postnatal age (PNA) split by different gestational ages (GA). The solid lines are the null-lines, and the dashed lines indicate %PE<sub>GFR</sub> of  $\pm$  50% range. The *x*-axis is on log-scales

birth is 0.70, 1.23, 2.46 ml/min, respectively). Thereafter, the maturation rate of GFR with PNA is dependent on GA. For neonates with a GA around 34 weeks, GFR increases almost linearly with PNA, while for neonates with a GA above 34 weeks, GFR increases rapidly during the first 10 days after which a slower increase is seen; for neonates with a GA under 34 weeks, GFR increases gradually at early PNA after which a more rapid increase is seen after 30 days. It took 22.3, 20.2, and 11.4 days to double the initial GFR values for neonates with a GA of 26.1, 30.6, 37.3 weeks, corresponding to neonates with a median BWb of 850 g, 1500 g, and 3000 g in the Fenton growth charts (26) for boys, respectively.

#### DISCUSSION

Using CL<sub>inulin</sub> as surrogate for GFR, our study evaluated different GFR maturation models from literature for their ability to predict GFR maturation in preterm and term neonates and young infants. Our evaluations show that the De Cock 2014a (4) model, for which an inulin-based CLp estimation was used, outperformed other models and had the best predictions for GFR in the neonatal population across the range of GA, BWb, and PNA studied. This model indicates that GFR increases with BWb at birth and with PNA after birth. By further improving the De Cock 2014a (4) model, we found that

Table IV	Root Mean	Square Percenta	ge Predictio	n Error (%	RMSPE)	and Med	ian Perc	centage	Prediction	Error	(%PE)	for	Glomerular
		Filtration	Rate (GFR)	Predictions	by Litera	ture Mode	ls, Strat	tified by	GA Group	ps			

Models	%RMSPE	GFR		Median % <i>PE<sub>GFR</sub></i>				
	GA < 28	GA 28-31	GA 32-36	<b>GA</b> ≥ 37	GA < 28	GA 28-31	GA 32-36	GA ≥ 37
Salem 2021 (1)	286	203	98.9	51.4	216	139	73.5	3.95
Johnson 2006 (2)	1218	807	379	97.8	- 975	- 597	- 258	- 15.6
Rhodin 2009 (3)	39.1	41.8	47.8	63.1	- 36.3	- 19.4	- 2.03	5.14
De Cock 2014a (4) (amikacin-CLp)	39.3	42.7	40.6	43.9	- 30.2	- 29.4	- 33.3	- 37.3
De Cock 2014a (4) (inulin-CLp)	52.3	55.7	34.9	50.7	9.05	10.3	4.26	- 1.99
De Cock 2014b (5) (gentamicin-CLp)	87.4	81.7	70.0	52.0	- 89.5	- 84.5	- 71.6	- 40.9
De Cock 2014b (5) (inulin-CLp)	64.5	56.3	63.6	174	- 65.7	- 49.4	- 7.15	92.4
Mahmood 2016 (6)	39.4	46.5	45.6	101	- 28.1	- 23.4	- 10.4	40
Anderson 2018 (7)	59.0	74.8	77.8	83.4	14.5	33.1	52.0	32.9

GA gestational age (weeks)

the postnatal maturation rate of GFR is dependent on both PNA and GA. The latter is the reason for the varying postnatal GFR maturation rates that seen in Fig. 4. The optimized De Cock model can be used to predict clearance of drugs mainly eliminated by GFR, for which only a drug-specific CLp value may be required for the drug of interest.

In our study, seven models were assessed, and six of them included patients that ranged from neonates to adults. The only exception was the De Cock 2014a model (4), which only focused on neonates. This may explain why this model outperformed the other six models, as the other six models aimed to predict of renal function across the entire age-range, and were less focused on the predictions in a neonatal subpopulations, let alone to focus on the prenatal and postnatal difference in neonates. The model of Salem et al. (1) did take into account the discrepancy in GFR for neonates with the same PMA but with different GA. Their model performed well in term neonates but less well in preterm neonates. The reason for this misspecification may be that they carried out a bootstrap to generate missing individual CL<sub>inulin</sub>, GA, and PNA data using reported mean, SD, or range, which may have impacted the trend of GFR over age, especially in the event of sparse data in preterm neonates. In the Rhodin 2009 model (3), a trend of  $PE_{GFR}$ % with PNA was observed. This may indicate the effect of PNA on GFR for neonates even with the same PMA. Since this model predicted the GFR ontogeny in neonates and infants generally well, and connected GFR maturation function from neonates to adults, the model might be very suitable for those cases where the aim is to predict clearance in neonates based on adult values (42).

It is important to highlight that in the De Cock 2014a (4) model, the inulin-estimated CLp (0.0766) is 1.60-fold higher than the amikacin- (0.049) and gentamicin-based CLp (0.049). This means that GFR predicted in our model is higher than the typical clearance of those drugs in neonates. This difference can hardly be accounted for by the unbound fraction, because these drugs exhibit low plasma protein binding in adults, and the binding percentage should even be lower in neonates because of lower drug binding plasma protein concentrations (43). Multiple explanations then seem possible. Firstly, in the study of De Cock 2014a (4),

aminoglycosides were used in sick neonates who may have been intubated, had sepsis or respiratory distress syndrome, which all have been reported to impact renal function (23, 44). Although some subjects included in our study were also sick and intubated, this number was small and our study could not identify a statistically significant impact of them on GFR maturation. Secondly, co-medications in De Cock et al. (4) population involved non-steroidal anti-inflammatory drugs (NSAIDs). This could hamper GFR, and aminoglycosides itself are also nephrotoxic (23, 44). However, the impact of the co-medication may not be that important as the effect of ibuprofen was accounted for in the original De Cock 2014a (co-medication of ibuprofen lead to a decrease of drug clearance by 16%) (18). Thirdly, the difference may indicate that reabsorption processes at the level of the renal tubular cells are involved in the renal clearance of aminoglycosides. This phenomenon has been proven in both rabbits and human studies, which showed that the GFR is higher than clearance of aminoglycosides within the same population (45, 46). Still, more research is needed to identify the exact cause.

In the optimized model, prenatal maturation of GFR represented by inulin clearance was found to be determined by BWb. This is consistent with an autopsy study of Hughson et al. (47), who found a linear relationship between the total number of glomeruli and BWb, and predicted an increase of 257,426 glomeruli per kilogram increase in birthweight. Compared to BWb, GA was found to be a less suitable predictor for the prenatal GFR maturation in our model development. This is not counterintuitive as infants with asymmetric or type II intrauterine growth retardation were shown to have lower nephron numbers than controls at similar gestational ages (20, 48). After birth, rapid changes in GFR occur and in our study GFR was shown to increase with PNA at different rates dependent on GA. Similarly, studies based on creatinine clearance have found that the rate of postnatal GFR increase is less marked in the most premature infants compared with term neonates, and this difference could persist during the first month of life (49–51).

By defining prenatal and postnatal maturation using different covariates, our study indicates that prenatal and postnatal GFR maturation indeed follows different maturation patterns. The different patterns between prenatal and

Table V	V	Function	and	Parameter	Estimates	of Final	Optimized	Model
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	Final optimized model
Function Parameters	$GFR = CLp \times \left[\frac{BWb}{1.75} + \left(\frac{GA}{34}\right)^a \times b \times \left(\frac{PNA}{2}\right)^{\left(\frac{GA}{34}\right)^c}\right]$
CLp	0.086 (3 %) 9.99 (8 %)
ь b	0.154 (12 %)
c Inter-study variability on CLP	- 1.71 (15 %) 19.2 % (23 %) [8 % ]
Inter-patient variability on CLP Residual variability	31.5 % (5 %) [11 %] 0.0284 (18%) [45 %]

BWb birthweight in kilograms, CLp drug-specific parameters, GA gestational age (weeks), PNA postnatal age (days)

postnatal renal maturation have an anatomic correlate, as proved by Sutherland *et al.* (52), who conducted an autopsy study comparing the kidneys from preterm neonates and stillborn gestational controls of similar postconceptional age (24 to 38 weeks). They found that preterm neonates exhibited accelerated postnatal renal maturation compared with postconceptional age-matched still-born controls. In addition, they observed that preterm kidneys had a greater percentage of morphologically abnormal glomeruli compared to controls, which might explain why preterm neonates showed a slower GFR maturation and consistently lower GFR than term neonates in the first 2 months after birth



Fig. 3 Goodness of fit plots for the final optimized model grouped by gestational age



**Fig. 4** Glomerular filtration rate (GFR) versus postnatal age simulated from the final optimized model in typical neonates with different birthweight (BWb, g) and the corresponding gestational age (GA, weeks) generated from Fenton growth charts (26) for boys (solid line) and girls (dashed line). The symbols are the observed inulin clearance values (30–41)

(Fig. 4). However, our study also showed that for preterm neonates with GA < 34 weeks the maturation rate of GFR is gradually increasing while in neonates with GA > 34 weeks, the maturation rate of GFR is gradually slowing down. As there were very limited data of inulin clearance after 30 days of PNA, whether and when the preterm neonates will catch up afterwards with their term peers is still unknown.

The GFR maturation trend shown in this study underlines the importance of BWb or GA and PNA-based dosing of primarily renally cleared drugs. In order to achieve a comparable exposure among all neonates, different dosing regimens should be used for different BWb or GA and PNA groups. These BWb or GA and PNA-based dosing strategies have already been suggested for amikacin, gentamicin, and tobramycin (53, 54). This should also be considered for other drugs primarily cleared by glomerular filtration that have not yet been investigated sufficiently.

The inulin clearance in neonatal population showed large variability (Fig. 1). Although part of this have been explained by BW, GA, and PNA, there is still unexplained variability that is possibly due to the different health conditions of included patients (31% inter-individual variability), as well as the different assay and measurement methodologies of inulin used in different studies (19% inter-study variability).

Our study has some limitations. First, as not all papers reported complete individual demographic information, some values were imputed, which might have impacted our model comparisons and parameter estimates. However, as our study has tried to reduce bias as much as possible by imputing missing demographic values based on the known relationship between covariates in neonates (*e.g.*, growth charts of BW and GA, WT and PNA), we believe this impact is limited. Moreover, it cannot be excluded that the individuals included in this study do not represent the overall (healthy) neonatal population, because not all the included subjects were healthy and we were not able to detect the influences of recorded disease. Next, the available data on inulin clearance in term neonates with PNA > 30 days is limited (Fig. 1). Therefore, the predictions for PNA > 30 days might be less accurate and require further validation. Finally, our study intentionally only collected data up to 90 days, which prevented us to investigate the connection of GFR predictions from neonates to older children and the adults.

### CONCLUSION

To predict GFR maturation in (pre)term neonates and young infants, and using CL<sub>inulin</sub> data as reference, the De Cock 2014a (4) model with CLp adjusted for CL<sub>inulin</sub> had the best performance across GA and PNA. This was followed by the Rhodin 2009 model (3), which, however, displayed biased predictions with increasing PNA. Based on these results, we concluded that neonatal GFR maturation models require a distinction between pre- and postnatal GFR maturation. Prenatal GFR maturation in (pre)term neonates is determined by BWb, with a higher BWb indicating a higher GFR at birth. To capture the varying postnatal GFR maturation rates, we included GA as determinant for PNA-dependent maturation in the optimized GFR maturation model, which can subsequently be used to predict clearance in renally cleared drugs across the heterogeneous population of (pre)term neonates and young infants.

#### SUPPLEMENTARY INFORMATION

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### **AUTHOR CONTRIBUTION**

Y.W, K.A, E.H.J.K, C.A.J.K, and S.V were involved in study design, acquisition of data, performing the analysis, data interpretation, drafting, revising the manuscript, and final approval. R.B.F and S.H.P.S were involved in study design, interpretation of data, drafting, and revising the manuscript and final approval.

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Conflict of Interest The authors declare no conflict of interest.

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