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## **Trends in discharge prescription of digoxin after Norwood operation:**

**An analysis of data from the Pediatric Health Information Systems (PHIS) database**

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## **Abstract**

**Introduction:** Quality improvement efforts have focused on reducing interstage mortality for infants with hypoplastic left heart syndrome (HLHS). In 1/2016 two publications reported that use of digoxin was associated with reduced interstage mortality. The degree to which these findings have affected real world practice has not been evaluated.

**Methods:** The discharge medications of neonates with HLHS undergoing Norwood operation between 1/2007 and 12/2018 at Pediatric Health Information Systems Database hospitals were

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DECLARATIONS

**Conflicts:** No financial conflicts of interest to disclose.

**Ethics Approval:** The manuscript describes an analysis of a de-identified administrative dataset. The Institutional Review Board at our institution has ruled that all analyses from this database are exempt from review.

**Availability of data and code:** The data analyzed is proprietary and cannot be shared under the conditions of our data use agreement. Analytic code will be shared on request provided the requestor pledges that it will be used for academic purposes and appropriate citation is applied.

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studied. Mixed effects models were calculated to evaluate the hypothesis that the likelihood of digoxin prescription increased after 1/2016, adjusting for measurable confounders with furosemide and aspirin prescription measured as falsification tests. Inter-hospital practice variation was measured using the median odds ratio.

**Results:** Over the study period 6,091 subjects from 45 hospitals were included. After adjusting for measurable covariates, discharge after 1/2016 was associated with increased odds of receiving digoxin (OR: 3.9, p<0.001). No association was seen between date of discharge and furosemide  $(p=0.26)$  or aspirin  $(p=0.12)$ . Prior to 1/2016, the likelihood of receiving digoxin was decreasing (OR:  $0.9$  per year, p<0.001) while after  $1/2016$  the rate has increased (OR:  $1.4$  per year, p<0.001). However, there remains significant inter-hospital variation in the likelihood of receiving digoxin even after adjusting for known confounders (median odds ratio= $3.5$ , p<0.0001).

**Conclusion:** Following publication of studies describing an association between digoxin and improved interstage survival, the likelihood of receiving digoxin at discharge increased without similar changes for furosemide or aspirin. Despite concerted efforts to standardize interstage care, inter-hospital variation in pharmacotherapy in this vulnerable population persists.

#### **Keywords**

Outcomes; pharmacoepidemiology; health services research; pediatrics; pediatric cardiology

## **Introduction:**

The interstage period between Norwood operation and superior cavopulmonary connection operation has been identified as a period of high risk for infants with hypoplastic left heart syndrome (HLHS) and anatomic variants with historical series reporting mortality rates between  $10-19\%$ <sup>1-10</sup>. As a result, improving survival in this period has been the focus of concerted local<sup>2–6,8,11</sup> and national quality improvement efforts<sup>12,13</sup>. In January 2016, two publications separately reported that use of digoxin during the interstage period was associated with decreased interstage mortality<sup>14,15</sup>, after being presented at the American College of Cardiology and American Heart Association Scientific sessions in 2015. Contemporaneous studies reported that digoxin was being used in a minority of Norwood patients<sup>16,17</sup>, suggesting that digoxin prescription might be a modifiable factor with the potential to improve transplant-free survival through the interstage period.

To our knowledge, the effect of these findings on real world practice has not been studied. Therefore, we sought to study trends in the prescription of digoxin at discharge in neonates with HLHS after Norwood operation using data from the Pediatric Health Information Systems (PHIS) Database, hypothesizing that the likelihood of prescription would increase after the publication of these studies. We also sought to determine whether significant interhospital variation in the use of digoxin remained after adjusting for measurable confounders, hypothesizing that practice variation in prescription of digoxin would have decreased in parallel in this patient population.

## **METHODS:**

#### **Data source:**

The PHIS database contains administrative data from inpatient, emergency department, ambulatory surgery, and observation encounters from 45 not-for-profit, tertiary care pediatric hospitals in the United States. These hospitals are affiliated with the Children's Hospital Association (CHA) (Overland Park, KS). Data quality and reliability are assured through a joint effort between CHA and participating hospitals. Participating hospitals provide discharge/encounter data including demographics, diagnoses, and procedures as well as utilization data (e.g. pharmacy products, radiologic studies, and laboratory studies). Data are de-identified at the time of data submission and are subject to a number of reliability and validity checks.

#### **Study Population:**

We studied infants (age at admission <30 days) with HLHS who underwent Norwood operation at a PHIS hospital between 1/1/2007 and 12/31/2018. Subjects were identified using International Classification of Diseases version 9 and 10 (ICD-9 and ICD-10) codes. The study spanned periods in which both diagnosis code systems were used. ICD-9 codes for diagnoses and procedures were identified and converted to ICD-10 codes using United States Center for Medicare and Medicaid Services ICD-9 to ICD-10 crosswalk ([cms.gov](http://cms.gov)). Manual review of these tables was performed to ensure accuracy. As the focus of the study was on the use of digoxin in the interstage period, subjects who died prior to discharge or underwent orthotopic heart transplant during their Norwood hospitalization were excluded from analysis. Hospitals reporting five or fewer subjects either prior to or after 1/2016 were excluded to avoid including centers with extremely low Norwood volumes.

#### **Study Measures:**

Data were extracted from the PHIS database by direct query using ICD-9/10 codes for diagnoses and procedures and Clinical Transaction Codes (CTC) for pharmaceutical products. The primary exposure for this study was the date of discharge. The goal of the study was to capture discharge prescription of digoxin. PHIS records data from hospitalbased encounters and does not record discharge prescriptions. As a surrogate for a discharge prescription we sought to capture medications that subjects were receiving immediately prior to discharge. However, during design of the study we recognized that some discharge medications might not be administered and/or recorded on the day of discharge. To optimize sensitivity, the primary outcome was defined as digoxin ordered in the three days prior to discharge. Digoxin ordered on the day of discharge was also recorded for a pre-planned sensitivity analysis. We acknowledge that this does not account for changes in prescription after discharge, but at a minimum provides a best estimate of the intended treatment plan of the team at the hospital where the patient underwent their Norwood operation. We did not expect that the likelihood of prescribing aspirin or furosemide would have changed over the study period. Therefore, analogous data about their prescription patterns were also collected for use in falsification tests.

Data about a broad range of potential covariates were collected. During the design of the study, we suspected that documented arrhythmia would be associated with increased likelihood of digoxin use, as would factors suggestive of clinical instability (e.g. previous cardiac arrest, extracorporeal membrane oxygenation, discharge receiving opiate medications and prolonged length of stay)<sup>18</sup>. Not all factors associated with digoxin use are available in the current data set (atrioventricular valve regurgitation or ventricular  $dys function$ <sup>14</sup>. Other demographic (sex, race, insurance payer) and clinical (genetic syndrome and non-cardiac medical conditions) factors were also considered as potentially influential. Non-cardiac medical conditions were grouped by type as described previously<sup>19</sup>. A limitation of these codes is that it is not possible to determine which of these conditions were present before Norwood operation and which occurred after, but because the influence of these conditions on likelihood of receiving digoxin is not related to their timing this distinction was less important in this case. The type of Norwood operation (Blalock-Taussig shunt vs. right ventricle to pulmonary artery conduit vs. hybrid) was also considered as a potential factor influencing digoxin prescription, but this was not well delineated in the database and so could not be used.

#### **Statistical Analysis**

The characteristics of the study population were described using standard descriptive statistics. Continuous variables were expressed as mean  $\pm$  standard deviation or median (interquartile range (IQR) and range) as appropriate. Categorical data are expressed as counts and percentages.

Studying changes in likelihood of receiving digoxin was our primary aim. As noted, the two studies14,15 that highlighted the potential benefits of digoxin in the interstage period were published in 1/2016 but were presented in March and November of 2015 at the American College of Cardiology and American Heart Association Scientific Sessions. We chose 1/2016 as an inflection for analysis, recognizing that early dissemination was a possibility that would (if anything) bias our results towards the null. We chose (prior to analysis) to keep this pre-specified threshold regardless of subsequent observations, which would potentially bias our results towards the null. The observed rate of digoxin prescription per year of discharge was calculated. The likelihood of discharge prescription prior to 1/1/2016 was compared to the likelihood after that date using a chi-square test. The same analysis was applied to furosemide and aspirin. A key source of potential bias in studies comparing two different periods is changes in the case-mix of the study population between the compared times. Differences in the distribution of possible covariates were compared between subjects discharged before and after 1/2016 using Student's t-test, Wilcoxon rank sum, and Chisquare tests.

To address any potential bias from differences in the distribution of these covariates, multivariable models were calculated. The degree to which covariates influenced the likelihood of receiving digoxin (or other medications) was not known. We sought to identify pertinent covariates empirically, and so evaluated the association between each covariate and the receipt of digoxin. To avoid bias, a liberal threshold ( $p<sub>0.2</sub>$ ) was used to determine which factors would be included in subsequent models<sup>20</sup>. Mixed effects models (using generalized

linear models with logit link) including these covariates as fixed effects and clustering by hospital were performed. Two main models were calculated 1) separating the cohort into those discharged before and after 1/2016 and 2) evaluating the rate of change in likelihood before and after 1/2016. The latter analysis is an extension of a difference-in-difference analysis (controlling for secular trends in behavior preceding the change). An interrupted time series methodology, specifically including an adoption period during which changes in practice were ignored, was not performed because prior to analysis it was not clear how long dissemination and adoption of new practices would take in an era characterized by potentially rapid dissemination of research findings (electronic communication and prevalent quality improvement efforts). Omitting an adoption period also has the potential to bias our results towards the null.

Measuring variation in practice between centers in the sample was a pre-identified secondary goal. To do so, we utilized the mixed effects model to calculate the median odds ratio for treatment with digoxin. The median odds ratio (MOR) is a means of quantifying the magnitude of variation in practice between hospitals in a sample and has been used in multiple studies of adult<sup>21–24</sup> and pediatric<sup>25–29</sup> cardiac patients. It represents the relative odds that a single hypothetical patient would receive different care (i.e. digoxin or not) at two randomly selected hospitals in the sample<sup>30</sup>. An MOR>1.2 is considered of significant magnitude, reflecting meaningful practice variation<sup>30</sup>.

Several pre-specified sensitivity analyses were performed to measure whether choices made in the design phase inadvertently introduced important systematic error(s). First, analyses were repeated with receipt of a medication within 1 day of discharge as the outcome. Second, an analysis was performed excluding hospitals in which a disproportionate number of the potential subjects were from either the period before or after 1/2016. The average proportion of cases after 2016 was 28% with a standard deviation of 11%. We excluded hospitals where the proportion of cases after 2016 were more than two standard deviations from this average (either <6% or >50%). Ultimately, this excluded two centers (both of which had a disproportionately large proportion of cases after 1/2016). Third, an analysis was performed restricted to subjects in which no arrhythmia was recorded to account for bias(es) introduced by changes in coding of arrhythmia or in the treatment of dysrhythmia in this population. One post-hoc sensitivity was performed. We had not excluded subjects kept in hospital through a second stage operation. To evaluate whether this introduced bias, we repeated our primary models excluding subjects whose LOS was >90 days. Because of concerns raised that the prevalence of comorbid conditions was influenced by the conversion from ICD-9 to ICD-10 coding, a post-hoc sensitivity analysis was performed of the primary model with comorbid non-cardiac disease removed from the model.

A post-hoc secondary analysis was performed to evaluate the response of individual hospitals over the study period. The likelihood of receiving digoxin was calculated for each hospital for the period before 1/1/2016 and after and depicted. The change in likelihood was calculated using the sign rank test. A second post-hoc analysis was performed to evaluate whether Norwood operation annual volume was associated with likelihood of discharge prescription of digoxin. Norwood volume was incorporated in the primary model as either a

Missing data were generally infrequent (<1% for most variables). However, data for race were missing for a significant number of patients, which is typical for studies using administrative data $25,28,32-36$ . To mitigate potential bias, a separate categorical variable for "missing race" was generated. Otherwise cases with missing data were excluded by case restriction, and no imputation was applied, since the benefit for addressing these rare instances was minimal. The primary analyses were pre-specified, and other analyses should be considered exploratory. No formal adjustment for multiple comparisons was made.

All data analysis was performed using Stata MP 13 (Statacorp, College Station, TX). The threshold for statistical significance was  $p<0.05$ .

## **RESULTS**

#### **Study population:**

Initial query of the PHIS database generated a study cohort of 6,154 subjects from 51 hospitals. Based on exclusion criteria, 63 subjects from 6 hospitals were excluded leaving 6,091 subjects from 45 hospitals in the analytic cohort. The population was 62% male and 54% non-Hispanic white with 40% receiving commercial insurance and 49% receiving Medicaid (Supplementary Table 1).

Dividing the study population between those discharged before 1/2016 and those after, there were several significant differences (Table 1). Notably the proportion of subjects with neurologic conditions ( $p=0.01$ ), renal conditions ( $p<0.001$ ), gastrointestinal conditions ( $p<0.001$ ), metabolic disorder ( $p=0.001$ ), and technology dependence ( $p<0.001$ ) were all higher in subjects discharged in or after 2016 than those discharged before. At the same time, the prevalence of genetic syndromes was significantly less in those discharged in or after 2016 ( $p=0.02$ ). The proportion who received ECMO was also higher (11% vs. 8%)  $p<0.001$ ). Total and post-operative length of stays were greater in those discharged in or after 2016 ( $p<0.001$  for both).

#### **Observed trends in use of digoxin:**

The proportion of subjects receiving digoxin at discharge was significantly higher in those discharged on or after  $1/2016$  compared to those discharged earlier (43% vs.23%,  $p<0.01$ ). There was no significant difference in the likelihood of receiving aspirin ( $p=0.65$ ) or furosemide ( $p=0.25$ ) over the same period. The percentage of subjects receiving digoxin, furosemide, and aspirin is depicted in Figure 1. In sensitivity analyses no significant differences in these associations were observed.

#### **Adjusted analyses of the use of digoxin**

Bivariable screening of factors was performed (Table 2), and a mixed effects model for the likelihood of digoxin was calculated (Table 3). Discharge on or after 1/2016 was associated with increased odds of receiving digoxin (OR: 3.83, 95% CI: 3.29–4.48,  $p\text{\textless}0.001$ ). No such association was seen for either furosemide  $(p=0.33,$  Supplementary Table 2) or aspirin

(p=0.06, Supplementary Table 3). As planned a second model was also performed evaluating trends in digoxin usage over time before and after 1/2016 (Table 4). Prior to 2016, the odds of receiving digoxin were lower with each year (OR: 0.94 per year, 95% CI: 0.91–0.96,  $p<0.001$ ). After 2016, the trend reversed and increasing time was associated with larger odds (OR: 2.38 per year, 95% CI: 2.14–2.64,  $p<0.001$ ). In sensitivity analyses, restricting analysis to medications received within 1 day of discharge, likelihood of receiving aspirin was significantly less likely after 2016 than before (OR:  $0.85$ ,  $95\%$  CI:  $0.72-1.00$ ,  $p=0.04$ ). No other changes in the observed associations were seen in other specified sensitivity analyses (data not shown).

In the primary model (Table 3), several subject-level factors were associated with the likelihood of receiving digoxin. Known arrhythmia was associated with increased odds of receiving digoxin (OR: 1.42,  $p<0.001$ ). Prolonged length of stay (OR: 1.48,  $p<0.001$ ), technology dependence (OR: 1.34,  $p=0.01$ ), receipt of aspirin (OR: 2.71,  $p<0.001$ ), and receipt of furosemide (OR: 3.31,  $p \times 0.001$ ) were also associated with odds of receiving digoxin. Prematurity (OR: 0.74,  $p=0.02$ ), renal conditions (OR: 0.75,  $p=0.02$ ), and neurological conditions (OR:  $0.65$ ,  $p=0.003$ ) were associated with decreased odds of receiving digoxin. Though point estimates changed, the associations were not significantly different in the second model. In sensitivity analyses, in which subjects with LOS>90 were restricted, no changes were seen in the main effects (data not shown).

#### **Practice variation:**

Before 1/2016, the median hospital in the sample discharged 17% of subjects with digoxin (IQR: 7–27%, range: 0–75%), and after 1/2016, the median hospital discharged 39% of subjects with digoxin (IQR: 16–62%, range: 0–78%, Figure 2A). At the hospital level, there was a significant increase in the likelihood of being discharged with digoxin when comparing the time periods (sign-rank test p<0.0001). Expressed a different way, prior to 1/2016, 7% of hospitals discharged >60% of Norwood survivors with digoxin, while after 1/2016, 31% of hospitals discharged  $>60\%$  of subjects with digoxin (Figure 2B,  $p=0.005$ ). However, the response was not uniform (Figure 3) as 71% (32/45) of hospitals demonstrated increased utilization of digoxin, with 22% (10/45) decreasing their utilization of digoxin (median change was −14% IQR: −21 to −9%). This is reflected in the observation that 33% of hospitals still discharge <20% of subjects with digoxin (Figure 2B).

Across the entire study period, in adjusted analyses, there is evidence of large magnitude practice variation (primary model: MOR: 3.56, 95% CI: 2.48–4.70 and secondary model: MOR: 3.50, 95% CI: 2.96–4.05). The magnitude of practice variation was not significantly different before (MOR: 4.00 9% CI: 2.58–5.57) and after 1/2016 (MOR: 5.01 95% CI: 2.90– 7.50). In post-hoc secondary analyses, procedural volume (expressed either as a continuous variable or dividing the study sample into four ordinal groups) was not significantly associated with the odds of receiving digoxin at discharge (data not shown).

### **DISCUSSION**

This observational study of practices at a number of US primary pediatric hospitals demonstrates that the use of digoxin for patients with HLHS at the time of discharge from

their Norwood hospitalization was decreasing prior to 2016 and that the trend reversed in 2016 and that utilizations has continued in a significant proportion of neonates with HLHS. This period coincided temporally with the publication of two papers $14,15$  demonstrating an association between digoxin usage and improved interstage outcomes. These trends were significant in both the observed proportion of cases in each era and in multivariable analyses adjusting for measurable confounders. Though in this design causality is challenging to ascertain, falsification tests to evaluate whether parallel trends could be seen in the prescription of either of two other common cardiac medications did not demonstrate similar trends, supporting that the observed associations were not due to changes in recording prescriptions or other secular trends.

The current analysis also evaluated the variation in the use of digoxin between hospitals. There was large-scale variation in practice that was not explained by differences in the casemix at different hospitals. Moreover, the magnitude of this variation was not significantly different before and after 2016. Though digoxin was used more frequently in the later era, its adoption was not uniform between hospitals, suggesting that there are unresolved issues regarding the use of digoxin in this population. Moreover, despite bridging a period of intense interest in collaboration across centers and quality improvement efforts, practice variation remained large both before and after 2016.

HLHS and anatomic variants continue to represent a challenge in pediatric/congenital cardiology with 5-year transplant-free survival of 60–70%37–42 and the consumption of resources out of proportion to its prevalence<sup>43</sup>. The interstage period between the Norwood operation and superior cavopulmonary connection has been identified as a period with a high risk of mortality, with historical series reporting rates between 10–19%1–10. Single-center studies have demonstrated impressive reductions in mortality after the introduction of intensive home monitoring programs<sup>2,4,6,8,11</sup>. However, results in multicenter series have been more modest<sup>44</sup>, underscoring the public health benefit of measures with the potential to further reduce interstage mortality. The observation that use of digoxin, a pharmaceutical that was at the time only used in a minority of Norwood patients<sup>16,17</sup>, was associated with reduced interstage mortality in two separate studies<sup>14,15</sup> would seem to be a powerful inducement to change practice.

The current study demonstrated a significant increase in the use of digoxin at discharge after Norwood operation after 2016. Utilization is far from universal, and though most centers increased their use, a minority did not. The current study is not designed to explore the general and center-specific reasons for this. The effect of digoxin on survival has not been evaluated in a prospective study, and the results were not replicable in a cohort of Norwood patients that included non-HLHS patients<sup>17</sup>. There is uncertainty regarding the mechanism that confers a benefit for digoxin (negative chronotropy, positive inotropy, diuresis, or some other mechanism). Tied to this, it is unclear whether all Norwood survivors would benefit from digoxin or whether the benefits are restricted to a subset of subjects with specific anatomic or physiologic traits. Moreover, digoxin has a narrow therapeutic index (difference between an effective and toxic drug level). There have also been concerns that in the original studies, the benefit associated with digoxin use may have been partially contaminated by the presence of unmeasured confounding<sup>45</sup>. How to address these questions remains unsettled.

Utilization of digoxin is highly variable between centers even after accounting for measurable confounders with the odds of a hypothetical patient receiving digoxin varying by a factor of 3.5 between two randomly selected hospitals in the sample. The current study cannot explore why digoxin prescription practices differ between study centers. The decision-making to prescribe digoxin for individual patients, by individual physicians, and for centers is complicated to evaluate and likely requires data that would be best collected in a prospective fashion. Large magnitude heterogeneity of practice demonstrates that there is equipoise for a potential clinical trial and/or sufficient variability in practice for an observational study (assuming a data source with sufficient clinical detail to address questions of unmeasured confounding was available). It was surprising in an era in which many operative centers are engaged in collaborative quality improvement initiatives that the magnitude of practice variation did not appear to change in the face of evidence supporting the use of digoxin.

An additional observation was that the cohort of subjects in the more recent era demonstrates an increased proportion of several factors associated with increased severity of illness (renal, gastrointestinal, neurological, technology dependence, and metabolic conditions). It is possible that this is an artifact of the transition from ICD-9 to ICD-10 coding systems. The ICD-10 system contains a much larger number of codes and it is possible that this expansion could result in a higher sensitivity for non-cardiac diagnoses. At the same time, this trend is consistent with the observation that the preoperative case complexity for cardiac surgical patients has increased over time<sup>37,46</sup>. A sensitivity analysis was performed to evaluate whether including these factors in models biased estimates of the treatment in the later period, which did not demonstrate evidence of bias. As noted previously, it is not possible to differentiate between preoperative conditions and morbidity that followed the operation. It is a reasonable hypothesis that increased prevalence of noncardiac conditions present before or after surgery would be associated with increased use of digoxin. However, the current models adjust for the presence of these factors mitigating bias introduced by any historical changes in case-mix. Also, in these models the association between individual factors and the likelihood of receiving digoxin is not homogenous. For instance, a subject that is technology-dependent (e.g. has a feeding tube) is more likely to receive digoxin, while subjects with renal or neurological disorders were less likely. The association between medical complexity and the receipt of digoxin is therefore not simple and is deserving of further attention.

There are several additional limitations to this study. Though care was taken to mitigate bias and confounding, an observational study of trends in the use of a therapy over time cannot "prove" a causal relationship. Administrative datasets have imperfect access to clinical data, specifically granular data (degrees of ventricular dysfunction or atrioventricular valve regurgitation), which might lead to unmeasured confounding. As noted, current inpatient medications are used in this study as a surrogate for discharge medications, and changes that might occur in medications in the outpatient setting cannot be addressed in this dataset. The study includes the years in which ICD-9 transitioned to ICD-10. This affects identification of cases (by diagnosis and procedure). However, since the outcome of interest in the study is coded using PHIS drug codes, this change does not introduce bias directly. Race data were missing in a significant minority of subjects, which is consistent with previous studies in this

database. Missing race was associated with increased likelihood of digoxin receipt. We cannot ascertain the etiology of this association in the current study. Because PHIS is a database of inpatient and observation encounters, the association between digoxin prescription and interstage mortality could not be evaluated. Though the number of subjects who ultimately underwent second stage palliations can be identified, this number would be a low-bound estimate since subjects who undergo subsequent operations at a different center would be lost to follow up in the PHIS database.

#### **CONCLUSION:**

The use of digoxin increased in the period following publication of data supporting its potential benefit during the interstage period. However, digoxin is still used in a minority of patients, and, independent of case-mix, there is significant variation in practice between hospitals. Determining which patients benefit from digoxin and improving the application of this therapy are both important goals for ongoing research.

#### **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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**Figure 1: Discharge prescription of digoxin, furosemide, and aspirin in neonates with hypoplastic left heart syndrome at PHIS hospitals 2007–2018**

The observed likelihood of receiving digoxin (blue diamond) along with furosemide (red square) and aspirin (green triangle) in each year of the study period are depicted. 95% confidence intervals are depicted in brackets. Hashed lines denote the date of publication of abstracts (A: American College of Cardiology, B American Heart Association) and manuscripts (C).

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#### **Figure 2: Use of digoxin by hospital**

A. Box and whiskers plot of the use of digoxin at hospitals in the study sample. The use of digoxin at the center level increased significantly (Sign rank test  $p<0.0001$ )

B. Bar graph depicts the hospitals-level distribution of discharge with digoxin after Norwood operation before (blue) and after (red)  $1/1/2016$ . (Fisher's exact test  $p=0.005$ )

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#### **Figure 3: Hospital level variation in the use of digoxin**

Bar plot of the percentage of subjects receiving digoxin at each hospital before 1/2016 (Left panel) or after 1/2015 (Right panel). Hospitals are sorted by their pre- 1/2016 utilization of digoxin in both panels. Use of digoxin increased at 71% (30/45) of PHIS hospitals, but also decreased at 22% of hospitals (10/45).

#### **TABLE 1:**

## Study cohort





Abbreviations: ECMO extracorporeal membrane oxygenation, GA gestational age, LOS length of stay

#### **Table 2:**

#### Factors associated with digoxin use



Abbreviations: ECMO extracorporeal membrane oxygenation, GA gestational age, LOS length of stay

#### **Table 3:**

Multivariable mixed effect model for likelihood of digoxin



Abbreviations: ECMO extracorporeal membrane oxygenation, GA gestational age, LOS length of stay

#### **Table 4:**

Multivariable mixed effect model for likelihood of digoxin with non-linear association for time



Median odds ratio: 3.49 (95% CI: 4.05–2.96 p<0.001)

Abbreviations: ECMO extracorporeal membrane oxygenation, GA gestational age, LOS length of stay