```
___
title: "The Health of a Nation"
output: html_document
---
```{r, include=FALSE}
\ensuremath{\sharp} To be run on a Windows environment and viewed in Google Chrome
# Candidate Number: ZVBZ7
<style type="text/css">
.table {
   width:90% !important;
}
</style>
```{r setup, include=FALSE}
knitr::opts chunk$set(echo = TRUE)
library(arulesViz)
library(betareg)
library(car)
library(caret)
library(dplyr)
library(fingertipsR)
library(geojsonio)
library(ggplot2)
library(htmltools)
library(leaflet)
library(mi)
library(psycho)
library(readr)
library(rmapshaper)
library(tibble)
library(tidyr)
```

```
# Get the indicies of multiple deprivation at LSOA level.
imd df <-
read csv('https://assets.publishing.service.gov.uk/government/uploads/syste
m/uploads/attachment data/file/467774/File 7 ID 2015 All ranks deciles and
_scores_for_the_Indices_of_Deprivation__and_population_denominators.csv')
# Add UTLA mapping
lsoa utla lookup <-
read csv('https://opendata.arcgis.com/datasets/95ecb220a30e41d5ae759cd1c9aa
929f 0.csv')
lsoa utla lookup <- lsoa utla lookup %>%
  select(LSOA11CD, UTLA18CD)
imd df <- merge(x = imd df, y = lsoa utla lookup, by.x = 'LSOA code
(2011)', by.y = 'LSOA11CD')
# Select only the subdomain totals
pop weighted ave domains <- imd df %>%
  select("Income Score (rate)", "Employment Score (rate)", "Education,
Skills and Training Score", "Health Deprivation and Disability Score",
                 "Crime Score", "Barriers to Housing and Services Score",
"Living Environment Score",
                 "Income Deprivation Affecting Children Index (IDACI) Score
(rate)",
                 "Income Deprivation Affecting Older People (IDAOPI) Score
(rate)", "Children and Young People Sub-domain Score",
                 "Adult Skills Sub-domain Score", "Geographical Barriers
Sub-domain Score", "Wider Barriers Sub-domain Score",
                 "Indoors Sub-domain Score", "Outdoors Sub-domain Score",
"Total population: mid 2012 (excluding prisoners)")
# Create population weighted averages for each UTLA
pop weighted ave domains <- pop weighted ave domains[, 1:15] /
pop weighted ave domains[,16]
pop weighted ave domains$UTLA18CD <- imd df$UTLA18CD
pop weighted ave domains <- pop weighted ave domains %>%
  group by (UTLA18CD) %>%
  summarise each(funs(mean))
```

```
# Create z scores of deprivation matrix and reverse polarity as low is good
on the deprivation scores
z data imd <- pop weighted ave domains %>%
  standardize() %>%
  mutate each(funs(-.), -one of("UTLA18CD"))
# Get fingertips data
# Seleceted indicators from a variety of fingertips profiles selected to
fulfil the Marmot definitions of Social Determinants, Health Outcomes, and
Risk Factors
early years indicators <- indicators (DomainID = 1938133223)
social determinants df <- fingertips data(IndicatorID =</pre>
c(as.vector(early_years_indicators$IndicatorID), 93376, 22304, 10501,
90282, 91126, 91133, 92899, 90638, 93103, 93131, 93175, 91463, 90244,
90245, 92447, 91116, 92785, 91524, 91307), rank = T)
prevalance estimates = indicators(DomainID = 1938133099)
mortality indicators = indicators(DomainID=c(1000044, 1000049))
extra indicators =
as.vector(rbind(as.vector(prevalance estimates$IndicatorID),
as.vector(mortality_indicators$IndicatorID)))
health outcomes df = fingertips data(IndicatorID = c(extra indicators,
20101, 92718, 92724, 92725, 90287, 90641), rank = T)
behav risk factors = indicators(DomainID=c(1938132694, 1938133001))
inds <- c(as.vector(behav risk factors$IndicatorID), 30101, 113, 1203,</pre>
93085, 90323, 93077, 92527, 92937, 92588, 92443)
risk factors df = fingertips data(IndicatorID = inds, rank = T)
soc_dec_meta <- indicator_metadata(IndicatorID = c(IndicatorID =</pre>
c(as.vector(early years indicators$IndicatorID), 93376, 22304, 10501,
90282, 91126, 91133, 92899, 90638, 93103, 93131, 93175, 91463, 90244,
90245, 92447, 91116, 92785, 91524, 91307)))
risk fac meta <- indicator metadata(IndicatorID = inds)</pre>
health out meta <- indicator metadata(IndicatorID = c(extra indicators,
20101, 92718, 92724, 92725, 90287, 90641))
```

# Function that takes in a data frame and outputs a list of analysed data frames

```
analyze df <- function(df) {</pre>
  # Create a data frame of indicator polarities
  polarities <- df %>%
    select(IndicatorID, Polarity) %>%
    distinct() %>%
    spread(key = IndicatorID, value = Polarity)
  # Select as most recent for each indicator and restrict to persons rather
than include sex breakdowns
  most recent data <- df %>%
    group by(IndicatorID) %>%
    filter(TimeperiodSortable == max(TimeperiodSortable)) %>%
    filter(Sex == "Persons") %>%
    ungroup()
  # Select County & UA
  most recent data <- most recent data[grep('County',</pre>
most recent data$AreaType), ]
  # Transpose to wide data and remove any indicators with no data
  wide df <- most recent data %>%
    select(AreaCode, IndicatorID, Value) %>%
    tibble::rowid to column() %>%
    group by(IndicatorID, AreaCode) %>%
    spread(key = IndicatorID, value = Value) %>%
    summarise all(funs(na.omit(.)[1]))
  rownames(wide_df) <- wide_df$AreaCode</pre>
  wide_df <- wide_df %>%
    select(-rowid) # Remove row id column
  # Remove areas with over 50% missing data - areas with this are unlikely
to add any information as their values are more imputed than not
  wide df$proportna <- apply(wide df, 1, function(x) sum(is.na(x)) /</pre>
dim(wide df)[2])
```

```
wide df <- wide df[wide df$proportna < 0.5,]</pre>
  wide df <- wide df %>% select(-proportna)
  # Remove indicators with over 80% missing data
  wide df <- wide df[colSums(is.na(wide df)) / dim(wide df)[1] < 0.2]
  # impute missing data - using a Bayesian framework, with 30 inerations
and 4 chains. A random seed was chosen to ensure reproducability. The
bootstrap was envoked as a method of selecting random imputations.
  # http://www.stat.columbia.edu/~gelman/research/published/mipaper.pdf
  to impute <- wide df
  rownames(to impute) <- to impute$AreaCode</pre>
  to impute <- to impute %>% select(-AreaCode)
  imputed <- mi(as.data.frame(to impute), seed = 225)</pre>
  summary(imputed)
  imp img <- image(imputed) # Show heatmap of imputed values in heatmap</pre>
  imputed df \leftarrow mi::complete(imputed, m = 1) # Retrieve the dataframe
  imputed df <- select(imputed df, -contains("missing")) # Remove the
boolean 'missing' columns.
  norm reduced <- imputed df
  # Test colinearity - Indicators with high correlation will have 1
omitted.
  corr <- cor(norm reduced)</pre>
  hc <- caret::findCorrelation(corr)</pre>
  hc <- sort(hc)
  if (length(hc) == 0){
    reduced data <- norm reduced
  } else {
    reduced data <- norm reduced[, -c(hc)]</pre>
  }
```

```
# Polarity check and inversion. If 'Low is good', then the scores are
inverted to ensure the same direction of performance in the data.
 polarity check <- function(col name) {</pre>
    if (grepl(polarities[[col name]], "RAG - Low is good")) {
      z data[[col name]] <- -z data[[col name]]</pre>
    } else {
      z_data[[col_name]] <- z_data[[col_name]]</pre>
    }
  }
  # Create summary stats to use as the baseline measure for future years
  create summary stats <- function(x){</pre>
    summary_stats <- sapply(x, function(x) c("Stand dev" = sd(x),
                          "Mean"= mean(x,na.rm=TRUE),
                          "n" = length(x),
                          "Median" = median(x),
                          "CoeffofVariation" = sd(x)/mean(x,na.rm=TRUE),
                          "Minimum" = min(x),
                          "Maximun" = max(x),
                          "Upper Quantile" = quantile(x,1),
                          "LowerQuartile" = quantile(x,0)
                     )
    return(summary stats)
  }
  # Create Z scores using psycho package's standardize() function.
  # Makowski, (2018). The psycho Package: an Efficient and Publishing-
Oriented Workflow for Psychological Science. Journal of Open Source
Software, 3(22), 470. https://doi.org/10.21105/joss.00470
  z data <- reduced data %>% standardize()
  names(z data) <- substring(names(z data), 2)</pre>
  z data <- z data %>%
                rename at(.vars = vars(ends with(".1")),
```

```
.funs = funs(sub("[.]1$", "", .)))
  polarities <- polarities[, colnames(z data)]</pre>
  # Create a dataframe of z-scores, create mean score & add area codes on.
  z data <- data.frame(z data, lapply(colnames(z data), polarity check))</pre>
  z_data <- z_data[, -c(1:ncol(polarities))]</pre>
  colnames(z_data) <- colnames(polarities)</pre>
  # Get metadata for indicators and set them to global variables to use
outside the function
  # Get Summary statistics for benchmarking
  metadata to return <- indicator metadata(IndicatorID = colnames(z data))</pre>
  summary_to_return <- create_summary_stats(reduced_data)</pre>
  z_data$mean <- apply(z_data, 1, mean)</pre>
  z data$AreaCode <- wide df$AreaCode</pre>
  # z mean <- z data %>% select(mean, AreaCode)
  return(list('data' = z data, 'metadata' = metadata to return, 'summary' =
summary to return, 'imp img' = imp img))
# Pass component data frames to analyze df and unpack results
health outcomes returned <- analyze df(health outcomes df)
health outcomes processed <- health outcomes returned$data
health outcomes metadata <- health outcomes returned$metadata
health outcomes summary <- health outcomes returned$summary
health_outcomes_imp_image <- health_outcomes_returned$imp_img
risk_factors_returned <- analyze_df(risk_factors_df)</pre>
risk_factors_processed <- risk_factors_returned$data</pre>
\verb|risk factors_metadata| <- \verb|risk_factors_returned| \$metadata|
risk factors summary <- risk factors returned$summary</pre>
risk factors imp img <- risk factors returned$imp img</pre>
```

```
# Add imd to social determinants and recalc mean
soc det returned <- analyze df(social determinants df)</pre>
soc det processed <- soc det returned$data</pre>
soc det metadata <- soc det returned$metadata</pre>
soc det summary <- soc det returned$summary</pre>
soc_det_imp_img <- soc_det_returned$imp_img</pre>
soc_det_processed <- merge(soc_det_processed, z_data_imd, by.x =</pre>
'AreaCode', by.y = 'UTLA18CD')
soc det processed$mean <- apply(soc det processed[,</pre>
!(names(soc det processed) %in% c('mean', 'AreaCode'))], 1, mean)
# Create a dta frame of z means from all the components
z means <- data.frame(health outcomes processed$mean,</pre>
soc det processed$mean, risk factors processed$mean,
risk_factors_processed$AreaCode)
names(z means) <- c("health outcomes", "social determinants",</pre>
"risk factors", "AreaCode")
z means$grand mean <- apply(z means[, !(names(z means) %in%</pre>
c('AreaCode'))], 1, mean)
z means$health outcomes.rank <- rank(z means$health outcomes, na.last =</pre>
FALSE)
z means$social determinants.rank <- rank(z means$social determinants,</pre>
na.last = FALSE)
z means$risk factors.rank <- rank(z means$risk factors, na.last = FALSE)</pre>
z_means$overall.rank <- rank(z_means$grand_mean, na.last = FALSE)</pre>
# Get shape files for UTLAs
utlas <-
geojson read("https://opendata.arcgis.com/datasets/d3d7b7538c934cf29db791a7
05631e24_0.geojson", what = 'sp')
# drop Wales
utlas <- utlas[grep('E', utlas$ctyua17cd), ]
# Reduce the size of the file
utlas <- ms simplify(utlas)
# Add z means to the geojson
utlas@data <- left join(utlas@data, z means, by = c("ctyua17cd" =
"AreaCode"))
# Set colour pallets for each of the components
```

```
pal grand <- colorNumeric(palette = "Spectral", domain = utlas$grand mean)</pre>
pal soc <- colorNumeric(palette = "Spectral", domain =</pre>
utlas$social determinants)
pal risk <- colorNumeric(palette = "Spectral", domain = utlas$risk factors)</pre>
pal outcomes <- colorNumeric(palette = "Spectral", domain =</pre>
utlas$health outcomes)
# Define labels for the map views
labs grand mean <- lapply(seq(nrow(utlas@data)), function(i) {</pre>
 paste0( '', utlas@data[i, "ctyua17nm"], '',
          'Health Index Score:', round(utlas@data[i, 'grand mean'],
3),'',
          'Rank:', utlas@data[i, 'overall.rank'], '')
})
labs soc <- lapply(seq(nrow(utlas@data)), function(i) {</pre>
 paste0( '', utlas@data[i, "ctyua17nm"], '',
          'Social Determinants Score:', round(utlas@data[i,
'social determinants'], 3),'',
          'Rank:', utlas@data[i, 'social determinants.rank'], '')
})
labs risk <- lapply(seq(nrow(utlas@data)), function(i) {</pre>
 paste0( '', utlas@data[i, "ctyua17nm"], '',
          'Risk Factors Score:', round(utlas@data[i, 'risk factors'],
3),'',
          'Rank:', utlas@data[i, 'risk factors.rank'], '')
})
labs_outcomes <- lapply(seq(nrow(utlas@data)), function(i) {</pre>
 paste0( '', utlas@data[i, "ctyua17nm"], '',
          'Health Outcomes Score:', round(utlas@data[i, 'health_outcomes'],
3),'',
          'Rank:', utlas@data[i, 'health outcomes.rank'], '')
})
# Create map
map1 <- leaflet(utlas) %>%
  # Base groups
  addTiles(group = "OSM (default)") %>%
  # Overlay groups
```

```
# addCircles(~long, ~lat, ~10^mag/5, stroke = F, group = "Quakes") %>%
  addPolygons (
    weight = 2, fillOpacity = 0.8, color = ~pal grand(grand mean), group =
"Health Index - Total", label = lapply(labs grand mean, HTML)) %>%
  addPolygons (
    weight = 2, fillOpacity = 0.8, color = ~pal soc(social determinants),
group = "Social Determinants", label = lapply(labs soc, HTML)) %>%
  addPolygons(
    weight = 2, fillOpacity = 0.8, color = ~pal risk(risk factors), group =
"Risk Factors", label = lapply(labs risk, HTML)) %>%
  addPolygons(
    weight = 2, fillOpacity = 0.8, color = ~pal outcomes(health_outcomes),
group = "Health Outcomes", label = lapply(labs outcomes, HTML)) %>%
  # Layers control
  addLayersControl(
    baseGroups = c("Health Index - Total", "Social Determinants", "Risk
Factors", "Health Outcomes"),
    overlayGroups = c("OSM (default)"),
    options = layersControlOptions(collapsed = FALSE)) %>%
  addLegend("bottomright", pal = pal grand, values = utlas$grand mean,
title = "Mean Z Scores for Index", opacity = 1)
# Download HALE data from GBD
temp <- tempfile()</pre>
download.file("http://s3.healthdata.org/gbd-api-2017-
public/e9890501faf9f59e13ea28802f789ac0 files/IHME-GBD 2017 DATA-e9890501-
1.zip", temp)
gbd data <- read csv(unz(temp, "IHME-GBD 2017 DATA-e9890501-1.csv"))</pre>
unlink(temp)
# Apply rank to HALE data
gbd data$gbd rank <- rank(gbd data$val)</pre>
gbd data$location[gbd data$location == "St Helens"] <- "St. Helens"</pre>
# Create comparision data frame between GBD and CHI and test similaritiy
using Spearman's Rho
comparision <- left join(utlas@data, gbd data, by = c("ctyua17nm" =</pre>
"location"))
```

```
cor_test <- cor.test(~ overall.rank + gbd_rank, data = comparision, method
= "spearman", continuity = F, conf.level = 0.95)

# Create a summary stats data frame with all the components
summary_stats <- cbind(as.data.frame(soc_det_summary),
as.data.frame(risk_factors_summary),
as.data.frame(health_outcomes_summary))
names(summary_stats) <- substring(names(summary_stats), 2)

summary_stats <- as.data.frame(t(summary_stats))
...

## Developing a Composite Health Index for England

## Background</pre>
```

In 2018 the Chief Medical Officer called for the development of a Composite Health Index (CHI) to be developed in order to quantify health as a national asset and to track changes in health over time[^1].

Dahlgren & Whitehead's model suggests that health is determined by genetics, life stage, individual risk factors and behaviours, wider social determinants and the interaction between all of these[^2]. The variation in risk factors and social determinants is closely linked to deprivation, with the least deprived people having a life expectancy almost 10 years longer than the most deprived, and can expect almost 20 years more without living with a disability[^3]. Social determinants of health mutable with changes in policy within local and central government, growth of GDP, and changes in the distribution of wealth. Risk factors can be modified through policy and societal change. Health outcomes are a product of social determinants of health and individual risk factors' interaction with health services, and so health service performance should be included.

Tackling health inequalities requires understanding social determinants of health, risk behaviours, and health outcomes, and tracking change over time across the whole population.

## Aims

This CHI will form a baseline measure of health from 2018 comprising of three component parts:

- \* Social determinants of health
- \* Individual risk factors and behaviours
- \* Health outcomes

The CHI will be presented by geographical area as to allow policy-makers to better understand the needs of their local populations and target interventions effectively.

#### ## Data Items

The CHI is based on academic theory as to the core components of health across the life course. Data items were selected to fulfill the definitions of social determinants, risk factors, and health outcomes defined in the Fair Society, Healthy Lives report (2010) (Table 1).

Table 1: Component parts of the determinants of health

```
| Social Determinants | Risk Factors | Health Outcomes |
| --- | --- |
| Early years | Alcohol | Loss of years of life |
| Education | Smoking | Loss of years of healthy life |
| Work | Obesity | Economic costs |
| Income | Drug Use | |
| Communities | | |
```

Data items were selected from publicly available indicators that will be reproduced over time to satisfy the core components. This will allow benchmarking to current levels. A search was carried out using the terms in Table 1 on Public Health England's (PHE) Fingertips platform and indicators were selected from a variety of profiles to provide coverage. The selected indicators are shown in Appendix 1. Some indicators are replicated in more than one component as they are important to more than one component. For example, infant mortality is important to both early years and loss of years of life and so it is included in both social determinants and health outcomes components.

Added to the social determinants component were data from the Indices of Multiple Deprivation (IMD) subdomains. These subdomains are designed to quantify different forms of deprivation that impact people's lives in various ways. The subdomains are included as there is large geographic variation in performance across the subdomains that warrants extra granularity provided by the subdomain scores[^4]. For example, Wokingham has the lowest deprivation in the 'income' subdomain, but has high 'geographical barriers' deprivation.

Most recent data were used, however this was not consistent as to when it was produced as different indicators have differing reproduction schedules and timeframes. This could introduce some confounds into the analysis as we are not always comparing performance within the same temporal period. The alternative was to limit our analysis to indicators that are produced over the same period, however this would have led to omitting potentially valuable information. For example suicide rate is an important health outcome measure that has to produced over a three year period to not be disclosive.

#### ## Methods

Data items were retrieved using the FingertipsR package for PHE indicators, and using webscraping to retrieve IMD data. IMD data were segregated at Lower Super Output Area (LSOA) geographies, and so these were aggregated up to Upper Tier Local Authority (UTLA) using Office for National Statistics (ONS) lookup tables. Population weighted subdomain totals were used to calculate z-scores as a measure of geographical dispersion around the England mean.

Fingertips data were filtered to retrieve the most recent data points for each indicator, and also filtered to exclude any breakdowns by sex and limited to UTLAs. After this, UTLAs with over 50% missing data were excluded, which led to the removal of two areas; City of London and the Isles of Scilly. Indicators with more than 20% data missing were removed from the analysis as they are deemed to be incomplete.

Missing data from the remaining indicators were imputed using multiple imputation. Data are fit to 4 Bayesian generalized linear models over 30 iterations, and missing values predicted using these models, with the best fit being selected for imputation[^5]. Heatmaps of the spread of the data before and after imputation are shown in Figure 1.

Normality of distribution within each of the indicators was assumed using the Central Limit Theorem. Indicators were tested for covariance and indicators using a pairwise correlation matrix with those indicators with

an [] selected for removal, with the most globally correlated indicator being removed (Table 2).

Z-scores were calculated for all indicators, and mean z-scores and ranks calculated for components, polarity switched where necessary. These were then aggregated into the CHI giving equal weighting to each of the components. Summary statistics for each indicator were output as a baseline measure for future years.

![Figure 1: Heatmaps showing spread of data, missing data and imputed data
for a) Social Determinants b) Risk Factors, and c) Health
Outcomes](https://i.imgur.com/dJkloMX.png)

Table 2: Indicators from each component removed for covariance reasons

```
| Social Determinants | Risk Factors | Health Outcomes |
| --- | --- |
| Smoking attributable mortality<br/>CHD: Recorded prevalence (all ages) | Under 75 mortality rate from cardiovascular diseases considered preventable<br/>Vunder 75 mortality rate from cancer |
| Under 75 mortality rate from cancer considered preventable |
| Under 75 mortality rate from liver disease |
| Under 75 mortality rate from respiratory disease |
| Hip fractures in people aged 65 and over |
| Mortality rate from causes considered preventable |
```

#### ## Results

A CHI based on publicly available, national, long-term data was created based on three components; social determinants of health, individual risk factors, and health outcomes (Appendix 3). The contribution of individual indicators to each component was calculated, and each component was given equal weighing in the construction of the CHI. This index was mapped to UTLAs to give an overall view of the distribution of health across England (Figure 2).

<sup>```{</sup>r map, echo=FALSE, out.width = '100%'}

```
map1
```

. . .

Figure 2: The CHI total mapped to UTLAs in England. Lower Mean Z Scores indicator lower health in that geographical area.

There were a total of 79 Fingertips indicators and 16 IMD subdomains included after exclusions for missing data and collinearity (Appendix 2). It is possible to disaggregate the CHI into each component. It is also possible to analyse the contribution of each indicator to the index. The plotted outputs are designed to highlight the areas with greatest need.

Rankings were also produced for the CHI and its components, primarily as a tool to validate the index against other indices that use differing methodologies. Outputs of the top 5 ranked areas (most need) are shown in Table 3.

Table 3: CHI and component scores (ranks) for the 5 areas identified as having the greatest need.

```
| Area | CHI | Social Determinants Component | Risk Factors Component | Health Outcomes Component |
| --- | --- | --- | --- |
| Blackpool | -1.132 (1) | -0.911 (2) | -0.959 (3) | -1.53 (1) |
| Kingston upon Hull | -1.079 (2) | -0.931 (1) | -1.055 (2) | -1.241 (2) |
| Knowsley | -0.885 (3) | -0.871 (3) | -0.757 (6) | -1.027 (5) |
| Middlesbrough | -0.873 (4) | -0.749 (7) | -0.764 (5) | -1.107 (3) |
| Hartlepool | -0.961 (5) | -0.511 (12) | -1.091 (1) | -0.961 (8) |
```

A comparative analysis were undertaken to verify the validity of CHI. Health Adjusted Life Expectancy (HALE) estimates, produced as part of the Global Burden of Disease study[^6], was selected as a comparator. Ranks were compared using a Spearman rank correlation test. There was a significant strong positive correlation between CHI and HALE.

```
```{r corr_, echo=FALSE}
cor_test
...
```

To track change over time, the means and standard deviations from this analysis are to be used in future z-score calculations to ensure the baseline stays stable. To this end, descriptive statistics were output for reference in future years (Appendix 3).

#### ## Discussion

A CHI was created to quantify, and track changes to, health across England. The outputs from this index appear to be in line with alternative measures of overall health, and also in line with previous literature on health inequalities. CHI shows a clear rural/urban divide that has been previously described[^7][^8]. There is also a north/south divide viewable if a line is drawn from the Bristol channel to the Wash, as has been previously described[^9][^10]. In addition to this, outputs from CHI may provide evidence for the 'healthy London effect', where London overperforms in health outcomes given the social determinants present (Figure 4)[^11].

![Figure 4: A comparison of the London boroughs performance in the a) social determinants and b) health outcomes components of CHI. There are lower than average z-scores for social determinants and above average z-score for health outcomes. This is in alignment with the 'healthy London effect'.

] (https://i.imgur.com/OyKQS55.png)

CHI highlights previously described health inequality divides and strongly correlates with alternative measures. This suggests that CHI is a robust measure of health across England that can be used as a baseline measure for future reference and evaluation. Each indicator is given an equal weighting within the construct of each component, and each component has an equal weighting in CHI. There might an increase in accuracy with a more sophisticated weighting mechanism in future. There is also a risk of changes to the methods used in creating the indicators used in CHI, and this would have to be accounted for in future years. Effort should be made to replicate CHI at clinical geographies, such as Clinical Commissioning Groups, to allow more targeted policy action.

![Figure 5: Stakeholder analysis assessing key stakeholders from public interest, national & international organisations, and local area commissioning bodies. Plot is of hypothetical power/interest plane with current positions plotted and aims of CHI marketing strategy denoted as arrows.

] (https://i.imgur.com/SQe2nvd.png)

A brief stakeholder analysis was undertaken to assess the current power and interest of selected stakeholders (Figure 5) [^12]. The CHI is intended to give evidential support for interventions for those with position power to use, such as the CMO and public health organisations. Local commissioning will use CHI to target resources to reduce health inequalities. There is

the potential for media attention to develop a negative narrative around geographical variations (eg, "postcode lottery"). The intention would be to combat negative power using expert power from CMO and central government to control the media narrative.

### ## Appendices

Appendix 1: Fingertips indicators selected to be included in analysis from Fingertips platform for each component before tests for missing data or covariance.

| Social Determinants | Risk Factors | Health Outcomes | | --- | --- | --- | | Population vaccination coverage - MMR for two doses (5 years old) | Fraction of mortality attributable to particulate air pollution | Sickness absence - the percentage of working days lost due to sickness absence | | School readiness: Good level of development at age 5 | Killed and seriously injured (KSI) casualties on the roads | Low birth weight of term babies: % of all live births | | Gap in the employment rate between those with a long-term health condition and the overall employment rate | Smoking status at time of delivery | Infant mortality | | Enough social contact in adult carers: % of adult carers | Child excess weight in 4-5 and 10-11 year olds - 4-5 year olds | Proportion of five year old children free from dental decay | | Low birth weight of term babies: % of all live births | Child excess weight in 4-5 and 10-11 year olds - 10-11 year olds | Mortality rate from causes considered preventable | | Breastfeeding prevalence at 6-8 weeks after birth | Proportion of the population meeting the recommended '5-a-day' on a 'usual day' (adults) | Under 75 mortality rate from all cardiovascular diseases | | Smoking at time of delivery: % of mothers | Excess Weight in Adults | Under 75 mortality rate from cardiovascular diseases considered preventable | Under 18 conceptions | Physically active adults (aged 19+) | Under 75 mortality rate from cancer | | Excess weight in Reception year: % of children aged 4-5 | Smoking prevalence in adults (aged 18+) | Under 75 mortality rate from cancer considered preventable | | Proportion of children aged 2-2½yrs offered ASQ-3 as part of the Healthy

Child Programme or integrated review | Estimated diabetes diagnosis rate |

Under 75 mortality rate from liver disease |

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| Hospital admissions caused by unintentional and deliberate injuries in
children (aged 0-4 years) | Admission episodes for alcohol-related
conditions | Under 75 mortality rate from liver disease considered
preventable |
 Successful completion of drug treatment - opiate users: % who do not re-
present within 6 months | Average number of portions of fruit consumed
daily at age 15 (WAY survey) | Under 75 mortality rate from respiratory
| Successful completion of drug treatment - non-opiate users: % who do not
re-present within 6 months | Hypertension: Recorded prevalence (all ages) |
Under 75 mortality rate from respiratory disease considered preventable |
| Successful completion of treatment for alcohol | Obesity: Recorded
prevalence (aged 18+) | Mortality rate from a range of specified
communicable diseases, including influenza |
| Self-reported well-being: % of people with a high anxiety score |
Depression recorded prevalence (QOF): % of practice register aged 18+ |
 Infant mortality | Stroke: Recorded prevalence (all ages) | Excess under
75 mortality rate in adults with serious mental illness |
| Long-term unemployment: rate per 1,000 working age population | CHD:
Recorded prevalence (all ages) | Emergency readmissions within 30 days of
discharge from hospital |
| STI testing rate (exc chlamydia aged <25) / 100,000 | Obese children
(10-11 years) | Proportion of adults in the population in contact with
secondary mental health services |
| HIV testing uptake, total (%) | Admission episodes for alcohol-specific
conditions - Under 18s | Health related quality of life for older people |
16-18 year olds not in education, employment or training: % of 16-18
year olds | Smoking attributable mortality | Hip fractures in people aged
65 and over |
| Proportion of supported working age adults with learning disability
living in unsettled accommodation (%) | Mortality rate from lung cancer |
Preventable sight loss - age related macular degeneration (AMD) |
| Adults receiving long term learning disabilities support from local
authority per 100 people on GP learning disabilities register | Under 75
mortality from colorectal cancer | Hip fractures in people aged 65 and over
- aged 65-79 |
| People taking up an NHS Health Check invite | Under 75 Mortality rate
from breast cancer | Preventable sight loss - glaucoma |
| Unemployment: % of working age population | Children killed and
seriously injured (KSI) on England's roads | Hip fractures in people aged
65 and over - aged 80+ |
| Claimants of benefits due to alcoholism | Density of fast food outlets |
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| Economic inactivity rate | | Excess winter deaths index (single year,

Preventable sight loss - diabetic eye disease |

all ages) |

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| % reporting depression or anxiety | | Preventable sight loss - sight
loss certifications |
| A&E attendances (0-4 years) | | Excess winter deaths index (single
year, age 85+) |
| Hospital admissions caused by unintentional and deliberate injuries in
children (aged 0-4 years) | | Excess winter deaths index (3 years, all
ages) |
| Emergency admissions (aged 0-4) | | Excess winter deaths index (3
years, age 85+) |
| A&E attendances (0-4 years) | | 4.16 - Estimated dementia diagnosis
rate (aged 65+) |
\mid Emergency admissions (aged 0-4) \mid \mid Healthy life expectancy at birth \mid
| Children with one or more decayed, missing or filled teeth | | Life
Expectancy at birth |
| Percentage of children at or above expected level of development in all
five areas of development at 2-2\frac{1}{2} years | | Life expectancy at 65 |
| Percentage of children at or above expected level of development in
communication skills at 2-2½ years | | Inequality in life expectancy at
birth |
| Percentage of children at or above expected level of development in
gross motor skills at 2-2\frac{1}{2} years | | Number of UTLAs where inequality in
life expectancy at birth has decreased |
| Percentage of children at or above expected level of development in fine
motor skills at 2-2\frac{1}{2} years | | Inequality in life expectancy at 65 |
| Percentage of children at or above expected level of development in
problem solving skills at 2-2½ years | | Gap in life expectancy at birth
between each local authority and England as a whole |
| Percentage of children at or above expected level of development in
personal-social skills at 2-2½ years | | Inequality in healthy life
expectancy at birth ENGLAND |
| Proportion of New Birth Visits (NBVs) completed within 14 days | |
Inequality in healthy life expectancy at birth LA |
| Proportion of infants receiving a 6 to 8 week review | | Estimated
prevalence of hypertension (all ages) - retired |
| Proportion of children receiving a 12-month review | | Estimated
prevalence of CHD (all ages) - retired |
| Proportion of children who received a 2-2½ year review | | Estimated
prevalence of stroke (all ages) - retired |
| Percentage of children achieving at least an expected level of
development across all learning goals in communication and language. | |
Estimated prevalence of CVD (all ages) - retired |
| Access to NHS dental services - successfully obtained a dental
appointment | | Estimated prevalence of COPD (all ages) - retired |
| | Estimated prevalence of diagnosed hypertension (16+) |
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| Suicide rate |

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| | Estimated prevalence of undiagnosed hypertension (16+) |
   | | Estimated prevalence of depression (all ages) |
  | | Estimated prevalence of CHD (55-79 yrs) |
  | | Estimated prevalence of CHD (55-79 yrs) |
   | | Estimated prevalence of stroke (55-79 yrs) |
   | | Estimated prevalence of peripheral arterial disease (PAD) (55-79
   | | Estimated prevalence of peripheral arterial disease (PAD) (55-79
| | Estimated prevalence of Heart failure (16+) |
| | Estimated prevalence of COPD (all ages) |
| | Rate of deaths from Cardiovascular Disease among people aged 65
years and over |
| | Rate of deaths from Cancer among people aged 65 years and over |
 | | Rate of deaths from Respiratory Disease among people aged 65 years
and over |
Appendix 2: Final indicators included in the CHI from Fingertips and IMD in
the components to which they contributed.
| Social Determinants | Risk Factors | Health Outcomes |
| --- | --- | --- |
 Population vaccination coverage - MMR for two doses (5 years old) |
Fraction of annual all-cause adult mortality attributable to anthropogenic
(human-made) particulate air pollution (measured as fine particulate
matter, PM2.5*). | Low birth weight of term babies: % of all live births |
| School readiness: Good level of development at age 5 | Killed and
seriously injured on roads | Under 75 mortality rate from all
cardiovascular diseases |
| Gap in the employment rate between those with a long-term health
condition and the overall employment rate | Child excess weight in 4-5 and
10-11 year olds - 4-5 year olds | Under 75 mortality rate from liver
disease considered preventable |
| Enough social contact in adult carers: % of adult carers | Child excess
weight in 4-5 and 10-11 year olds - 10-11 year olds | Under 75 mortality
rate from respiratory disease considered preventable |
| Low birth weight of term babies: % of all live births | Proportion of
the population meeting the recommended '5-a-day' on a 'usual day' (adults)
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| Excess weight in Reception year: % of children aged 4-5 | Percentage of
adults (aged 18+) classified as overweight or obese - current method |
Emergency readmissions within 30 days of discharge from hospital |
 Proportion of children aged 2-2½yrs offered ASQ-3 as part of the Healthy
Child Programme or integrated review | Physically active adults (aged 19+)
| Preventable sight loss - age related macular degeneration (AMD) |
| Hospital admissions caused by unintentional and deliberate injuries in
children (aged 0-4 years) | Smoking prevalence in adults (aged 18+) |
Preventable sight loss - glaucoma |
| Successful completion of drug treatment - opiate users: % who do not re-
present within 6 months | Estimated diabetes diagnosis rate | Preventable
sight loss - sight loss certifications |
| Successful completion of drug treatment - non-opiate users: % who do not
re-present within 6 months | Admission episodes for alcohol-related
conditions \mid Hip fractures in people aged 65 and over - aged 65-79 \mid
| Successful completion of treatment for alcohol | Average number of
portions of fruit consumed daily at age 15 (WAY survey) | Hip fractures in
people aged 65 and over - aged 80+ \mid
| Self-reported well-being: % of people with a high anxiety score |
Hypertension: Recorded prevalence (all ages) | Sickness absence - the
percentage of working days lost due to sickness absence |
| Infant mortality | Obesity: Recorded prevalence (aged 18+) | Excess
winter deaths index (single year, all ages) |
| Long-term unemployment: rate per 1,000 working age population |
Depression recorded prevalence (QOF): % of practice register aged 18+ |
Excess winter deaths index (single year, age 85+) |
| STI testing rate (exc chlamydia aged <25) / 100,000 | Stroke: Recorded
prevalence (all ages) | Excess winter deaths index (3 years, all ages) |
| HIV testing uptake, total (%) | Admission episodes for alcohol-specific
conditions - Under 18s | Excess winter deaths index (3 years, age 85+) |
| 16-18 year olds not in education, employment or training: % of 16-18
year olds | Deaths from lung cancer | Excess under 75 mortality rate in
adults with serious mental illness |
| Proportion of supported working age adults with learning disability
living in unsettled accommodation (%) | Under 75 mortality from colorectal
cancer | Health related quality of life for older people |
| Adults receiving long term learning disabilities support from local
authority per 100 people on GP learning disabilities register | Under 75
Mortality rate from breast cancer | Infant mortality |
| People taking up an NHS Health Check invite | Children killed and
seriously injured (KSI) on England's roads | Mortality rate from a range of
specified communicable diseases, including influenza |
| Unemployment: % of working age population | - | Proportion of adults in
the population in contact with secondary mental health services |
```

| Claimants of benefits due to alcoholism | - | Proportion of five year

old children free from dental decay |

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| Economic inactivity rate | - | Rate of deaths from Cardiovascular
Disease among people aged 65 years and over |
| % reporting depression or anxiety | - | Rate of deaths from Cancer among
people aged 65 years and over |
| A&E attendances (0-4 years) | - | Rate of deaths from Respiratory
Disease among people aged 65 years and over |
| Emergency admissions (aged 0-4) | - | Estimated dementia diagnosis rate
(aged 65+) |
Children with one or more decayed, missing or filled teeth | - | - |
| Proportion of New Birth Visits (NBVs) completed within 14 days | - | - |
| Proportion of infants receiving a 6 to 8 week review | - | - |
| Proportion of children receiving a 12-month review | - | - |
| Proportion of children who received a 2-2½ year review | - | - |
| Percentage of children achieving at least an expected level of
development across all learning goals in communication and language. | - |
| Access to NHS dental services - successfully obtained a dental
appointment | - | - |
| Income Score (rate) | - | - |
| Employment Score (rate) | - | - |
| Education, Skills and Training Score | - | - |
| Health Deprivation and Disability Score | - | - |
| Crime Score | - | - |
| Barriers to Housing and Services Score | - | - |
| Living Environment Score | - | - |
  Income Deprivation Affecting Children Index (IDACI) Score (rate) | - | -
Income Deprivation Affecting Older People (IDAOPI) Score (rate) | - | -
Children and Young People Sub-domain Score | - | - |
Adult Skills Sub-domain Score | - | - |
| Geographical Barriers Sub-domain Score | - | - |
| Wider Barriers Sub-domain Score | - | - |
 Indoors Sub-domain Score | - | - |
| Outdoors Sub-domain Score | - | - |
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Appendix 3: The CHI scores and rankings for UTLAs in England for 2018.

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| AreaCode | Overall Score | Health Outcomes | Health Outcomes Rank |
Overall Rank | Risk Factors | Risk Factors Rank | Social Determinants |
Social Determinants Rank |
| --- | --- | --- | --- | --- | --- |
  E06000001 | -0.85 | -0.96 | 8 | 5 | -1.09 | 1 | -0.51 | 12 |
  E06000002 | -0.87 | -1.11 | 3 | 4 | -0.76 | 5 | -0.75 | 7 |
  E06000003 | -0.36 | -0.38 | 29 | 24 | -0.45 | 19 | -0.25 | 40 |
  E06000004 | -0.25 | -0.28 | 39 | 41 | -0.22 | 41 | -0.24 | 44 |
  E06000005 | -0.21 | -0.27 | 41 | 44 | -0.23 | 40 | -0.12 | 60 |
  E06000006 | -0.32 | -0.35 | 31 | 29 | -0.18 | 44 | -0.42 | 20 |
  E06000007 | 0.19 | 0.405 | 124 | 104 | -0.05 | 69 | 0.218 | 104 |
  E06000008 | -0.41 | -0.77 | 11 | 19 | -0.17 | 46 | -0.3 | 32 |
  E06000009 | -1.13 | -1.53 | 1 | 1 | -0.96 | 3 | -0.91 | 2 |
  E06000010 | -1.08 | -1.24 | 2 | 2 | -1.05 | 2 | -0.93 | 1 |
  E06000011 | 0.15 | 0.055 | 73 | 98 | 0.074 | 85 | 0.322 | 120 |
  E06000012 | -0.32 | 0.036 | 70 | 28 | -0.57 | 10 | -0.44 | 16 |
  E06000013 | -0.1 | 0.091 | 77 | 56 | -0.41 | 21 | 0.024 | 78 |
  E06000014 | 0.15 | 0.306 | 111 | 97 | -0.01 | 72 | 0.158 | 99 |
  E06000015 | -0.04 | 0.196 | 93 | 64 | -0.15 | 51 | -0.16 | 54 |
  E06000016 | -0.29 | -0.62 | 15 | 34 | 0.166 | 101 | -0.43 | 18 |
  E06000017 | 0.48 | 0.772 | 145 | 138 | 0.229 | 106 | 0.439 | 131 |
  E06000018 | -0.53 | -0.54 | 18 | 12 | -0.45 | 18 | -0.6 | 11 |
  E06000019 | 0.099 | 0.184 | 90 | 86 | 0.01 | 78 | 0.102 | 88 |
  E06000020 | -0.11 | -0.08 | 61 | 54 | -0.08 | 65 | -0.16 | 55 |
  E06000021 | -0.42 | -0.44 | 24 | 18 | -0.19 | 43 | -0.63 | 9 |
  E06000022 | 0.379 | 0.359 | 119 | 128 | 0.443 | 132 | 0.336 | 122 |
  E06000023 | 0.077 | 0.148 | 87 | 82 | 0.365 | 124 | -0.28 | 37 |
  E06000024 | 0.326 | 0.327 | 114 | 121 | 0.367 | 125 | 0.285 | 114 |
  E06000025 | 0.635 | 0.561 | 139 | 146 | 0.605 | 144 | 0.74 | 149 |
  E06000026 | -0.12 | -0.09 | 60 | 51 | -0.03 | 71 | -0.25 | 43 |
  E06000027 | -0.4 | -0.91 | 9 | 21 | -0.1 | 63 | -0.19 | 49 |
  E06000028 | -0.09 | -0.19 | 52 | 60 | -0.15 | 52 | 0.074 | 82 |
  E06000029 | 0.266 | 0.229 | 98 | 116 | 0.112 | 90 | 0.456 | 133 |
  E06000030 | 0.113 | 0.042 | 71 | 88 | 0.151 | 96 | 0.145 | 97 |
  E06000031 | -0.01 | -0.19 | 50 | 68 | 0.246 | 109 | -0.08 | 66 |
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E06000032 | -0.11 | 0.022 | 67 | 52 | -0.11 | 62 | -0.25 | 42 |
E06000033 | -0.03 | -0.3 | 37 | 66 | -0.06 | 67 | 0.278 | 113 |
E06000034 | 0.017 | 0.103 | 79 | 73 | -0.27 | 36 | 0.219 | 105 |
E06000035 | 0 | 0.05 | 72 | 69 | 0.069 | 84 | -0.12 | 59 |
E06000036 | 0.646 | 0.655 | 142 | 148 | 0.613 | 145 | 0.671 | 145 |
E06000037 | 0.558 | 0.64 | 141 | 142 | 0.323 | 117 | 0.712 | 148 |
E06000038 | 0.04 | -0.19 | 51 | 77 | 0.248 | 110 | 0.061 | 80 |
E06000039 | -0.1 | -0.25 | 44 | 55 | 0.084 | 86 | -0.14 | 57 |
E06000040 | 0.599 | 0.671 | 144 | 144 | 0.554 | 142 | 0.572 | 140 |
E06000041 | 0.748 | 0.519 | 134 | 149 | 0.757 | 147 | 0.968 | 150 |
E06000042 | 0.172 | 0.254 | 101 | 100 | 0.086 | 87 | 0.177 | 101 |
E06000043 | 0.067 | -0.24 | 46 | 79 | 0.411 | 130 | 0.031 | 79 |
E06000044 | -0.24 | -0.34 | 33 | 42 | -0.11 | 59 | -0.27 | 39 |
E06000045 | -0.38 | -0.48 | 22 | 22 | -0.34 | 27 | -0.34 | 26 |
E06000046 | -0.09 | 0.12 | 80 | 59 | -0.36 | 24 | -0.02 | 75 |
E06000047 | -0.29 | -0.55 | 17 | 35 | -0.27 | 37 | -0.05 | 71 |
E06000049 | 0.32 | 0.469 | 129 | 120 | 0.037 | 81 | 0.454 | 132 |
E06000050 | 0.221 | 0.205 | 94 | 110 | 0.101 | 88 | 0.356 | 125 |
E06000051 | 0.139 | 0.452 | 127 | 93 | -0.15 | 50 | 0.115 | 90 |
E06000052 | 0.04 | 0.102 | 78 | 76 | -0.11 | 61 | 0.126 | 93 |
E06000054 | 0.365 | 0.52 | 135 | 127 | 0.179 | 102 | 0.395 | 129 |
E06000055 | 0.097 | -0.09 | 59 | 85 | 0.283 | 114 | 0.097 | 86 |
E06000056 | 0.463 | 0.659 | 143 | 136 | 0.129 | 93 | 0.601 | 141 |
E06000057 | 6.00E-04 | 0.026 | 68 | 71 | -0.15 | 47 | 0.13 | 94 |
E08000001 | -0.29 | -0.4 | 26 | 36 | -0.15 | 48 | -0.31 | 30 |
E08000002 | -0.15 | -0.38 | 27 | 49 | 0.051 | 82 | -0.11 | 61 |
E08000003 | -0.77 | -1.01 | 6 | 7 | -0.45 | 17 | -0.85 | 4 |
E08000004 | -0.3 | -0.15 | 55 | 33 | -0.25 | 39 | -0.48 | 13 |
E08000005 | -0.47 | -0.67 | 14 | 15 | -0.13 | 54 | -0.61 | 10 |
E08000006 | -0.48 | -0.7 | 13 | 14 | -0.46 | 16 | -0.28 | 38 |
E08000007 | 0.181 | 0.277 | 105 | 102 | 0.122 | 91 | 0.143 | 95 |
E08000008 | -0.38 | -0.43 | 25 | 23 | -0.28 | 34 | -0.43 | 19 |
E08000009 | 0.358 | 0.146 | 85 | 126 | 0.374 | 126 | 0.553 | 138 |
E08000010 | -0.32 | -0.58 | 16 | 27 | -0.29 | 33 | -0.1 | 63 |
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E08000011 | -0.89 | -1.03 | 5 | 3 | -0.76 | 6 | -0.87 | 3 |
E08000012 | -0.78 | -0.99 | 7 | 6 | -0.59 | 9 | -0.76 | 6 |
E08000013 | -0.5 | -0.53 | 20 | 13 | -0.69 | 7 | -0.28 | 36 |
E08000014 | -0.32 | -0.22 | 48 | 30 | -0.35 | 26 | -0.38 | 22 |
E08000015 | -0.22 | -0.3 | 36 | 43 | -0.21 | 42 | -0.16 | 53 |
E08000016 | -0.53 | -1.1 | 4 | 10 | -0.49 | 14 | -0.01 | 76 |
E08000017 | -0.3 | -0.29 | 38 | 31 | -0.52 | 12 | -0.08 | 65 |
E08000018 | -0.35 | -0.54 | 19 | 26 | -0.4 | 22 | -0.1 | 62 |
E08000019 | -0.17 | -0.06 | 63 | 47 | -0.27 | 35 | -0.18 | 50 |
E08000021 | -0.4 | -0.53 | 21 | 20 | -0.36 | 25 | -0.31 | 29 |
E08000022 | -0.11 | -0.04 | 64 | 53 | -0.44 | 20 | 0.156 | 98 |
E08000023 | -0.43 | -0.46 | 23 | 16 | -0.6 | 8 | -0.23 | 46 |
E08000024 | -0.63 | -0.73 | 12 | 8 | -0.78 | 4 | -0.37 | 23 |
E08000025 | -0.42 | -0.38 | 28 | 17 | -0.12 | 56 | -0.76 | 5 |
E08000026 | -0.26 | -0.26 | 43 | 39 | -0.15 | 49 | -0.37 | 25 |
E08000027 | -0.15 | -0.24 | 47 | 48 | -0.29 | 31 | 0.09 | 83 |
E08000028 | -0.58 | -0.81 | 10 | 9 | -0.48 | 15 | -0.45 | 15 |
E08000029 | 0.147 | -0.02 | 65 | 95 | 0.232 | 107 | 0.224 | 108 |
E08000030 | -0.3 | -0.24 | 45 | 32 | -0.32 | 28 | -0.33 | 28 |
E08000031 | -0.53 | -0.37 | 30 | 11 | -0.5 | 13 | -0.73 | 8 |
E08000032 | -0.25 | -0.21 | 49 | 40 | -0.18 | 45 | -0.37 | 24 |
E08000033 | -0.09 | 0.028 | 69 | 57 | -0.31 | 30 | 0.009 | 77 |
E08000034 | -0.17 | -0.11 | 58 | 46 | -0.12 | 58 | -0.29 | 35 |
E08000035 | -0.27 | -0.31 | 34 | 38 | -0.25 | 38 | -0.24 | 45 |
E08000036 | -0.35 | -0.35 | 32 | 25 | -0.39 | 23 | -0.31 | 31 |
E08000037 | -0.28 | -0.28 | 40 | 37 | -0.55 | 11 | -0.02 | 74 |
E09000002 | -0.19 | -0.3 | 35 | 45 | 0 | 74 | -0.25 | 41 |
E09000003 | 0.443 | 0.532 | 136 | 134 | 0.525 | 139 | 0.271 | 111 |
E09000004 | 0.283 | 0.356 | 117 | 117 | 0.204 | 104 | 0.288 | 116 |
E09000005 | 0.121 | 0.397 | 123 | 89 | 0.148 | 95 | -0.18 | 51 |
E09000006 | 0.518 | 0.427 | 125 | 140 | 0.598 | 143 | 0.529 | 137 |
E09000007 | 0.413 | 0.846 | 148 | 129 | 0.48 | 134 | -0.09 | 64 |
E09000008 | 4.00E-04 | 0.19 | 91 | 70 | 0.246 | 108 | -0.43 | 17 |
E09000009 | 0.196 | 0.292 | 108 | 107 | 0.324 | 118 | -0.03 | 73 |
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E09000010 | 0.121 | 0.392 | 120 | 90 | 0.359 | 121 | -0.39 | 21 |
  E09000011 | -0.07 | -0.12 | 57 | 62 | 0.122 | 92 | -0.22 | 47 |
  E09000012 | -0.07 | -0.07 | 62 | 61 | 0.152 | 97 | -0.3 | 34 |
  E09000013 | 0.071 | 0.068 | 74 | 80 | 0.289 | 115 | -0.14 | 58 |
  E09000014 | 0.095 | 0.192 | 92 | 84 | 0.397 | 128 | -0.3 | 33 |
  E09000015 | 0.461 | 0.555 | 137 | 135 | 0.54 | 140 | 0.287 | 115 |
  E09000016 | 0.19 | 0.282 | 106 | 105 | ##### | 76 | 0.29 | 117 |
  E09000017 | 0.355 | 0.301 | 109 | 125 | 0.41 | 129 | 0.354 | 124 |
  E09000018 | 0.142 | -0.16 | 54 | 94 | 0.495 | 136 | 0.091 | 84 |
  E09000019 | -0.02 | 0.137 | 84 | 67 | 0.01 | 79 | -0.22 | 48 |
  E09000020 | 0.602 | 1.187 | 150 | 145 | 0.785 | 148 | -0.17 | 52 |
  E09000021 | 0.498 | 0.216 | 96 | 139 | 0.801 | 149 | 0.478 | 135 |
  E09000022 | 0.126 | 0.129 | 82 | 91 | 0.331 | 119 | -0.08 | 67 |
  E09000023 | 0.128 | 0.15 | 88 | 92 | 0.138 | 94 | 0.096 | 85 |
  E09000024 | 0.442 | 0.395 | 122 | 133 | 0.548 | 141 | 0.383 | 128 |
  E09000025 | 0.004 | 0.084 | 76 | 72 | 0.257 | 111 | -0.33 | 27 |
  E09000026 | 0.243 | 0.322 | 112 | 112 | 0.342 | 120 | 0.064 | 81 |
  E09000027 | 0.812 | 0.913 | 149 | 150 | 0.824 | 150 | 0.699 | 147 |
  E09000028 | 0.154 | 0.206 | 95 | 99 | 0.291 | 116 | -0.04 | 72 |
  E09000029 | 0.345 | 0.217 | 97 | 124 | 0.45 | 133 | 0.368 | 127 |
  E09000030 | -0.04 | -0.18 | 53 | 63 | 0.508 | 137 | -0.46 | 14 |
  E09000031 | 0.022 | -0.13 | 56 | 74 | 0.274 | 112 | -0.08 | 69 |
  E09000032 | 0.427 | 0.357 | 118 | 131 | 0.633 | 146 | 0.29 | 118 |
  E09000033 | 0.329 | 0.778 | 146 | 122 | 0.365 | 123 | -0.15 | 56 |
  E10000002 | 0.581 | 0.557 | 138 | 143 | 0.509 | 138 | 0.679 | 146 |
  E10000003 | 0.433 | 0.467 | 128 | 132 | 0.36 | 122 | 0.472 | 134 |
  E10000006 | -0.09 | 0.133 | 83 | 58 | -0.32 | 29 | -0.08 | 68 |
  E10000007 | 0.032 | 0.075 | 75 | 75 | -0.12 | 57 | 0.143 | 96 |
  E10000008 | 0.214 | 0.247 | 99 | 109 | 0.157 | 98 | 0.239 | 109 |
  E10000009 | 0.256 | 0.254 | 102 | 114 | 0.03 | 80 | 0.482 | 136 |
  E10000011 | 0.08 | 0.26 | 103 | 83 | -0.13 | 55 | 0.112 | 89 |
  E10000012 | 0.178 | 0.275 | 104 | 101 | 0 | 75 | 0.261 | 110 |
  E10000013 | 0.293 | 0.518 | 133 | 119 | 0.165 | 100 | 0.194 | 102 |
| E10000014 | 0.424 | 0.471 | 130 | 130 | 0.18 | 103 | 0.62 | 143 |
```

```
E10000015 | 0.473 | 0.474 | 131 | 137 | 0.377 | 127 | 0.57 | 139 |
E10000016 | 0.149 | 0.248 | 100 | 96 | -0.01 | 73 | 0.208 | 103 |
E10000017 | -0.15 | -0.26 | 42 | 50 | -0.29 | 32 | 0.118 | 91 |
E10000018 | 0.335 | 0.326 | 113 | 123 | 0.281 | 113 | 0.397 | 130 |
E10000019 | -0.04 | 0.01 | 66 | 65 | -0.06 | 68 | -0.07 | 70 |
E10000020 | 0.193 | 0.445 | 126 | 106 | 0.008 | 77 | 0.125 | 92 |
E10000021 | 0.11 | 0.171 | 89 | 87 | -0.06 | 66 | 0.219 | 106 |
E10000023 | 0.238 | 0.485 | 132 | 111 | -0.14 | 53 | 0.365 | 126 |
E10000024 | 0.066 | 0.147 | 86 | 78 | -0.05 | 70 | 0.1 | 87 |
E10000025 | 0.644 | 0.782 | 147 | 147 | 0.483 | 135 | 0.669 | 144 |
E10000027 | 0.206 | 0.287 | 107 | 108 | 0.056 | 83 | 0.276 | 112 |
E10000028 | 0.076 | 0.121 | 81 | 81 | -0.11 | 60 | 0.221 | 107 |
E10000029 | 0.261 | 0.394 | 121 | 115 | 0.219 | 105 | 0.17 | 100 |
E10000030 | 0.554 | 0.622 | 140 | 141 | 0.428 | 131 | 0.612 | 142 |
E10000031 | 0.187 | 0.352 | 116 | 103 | -0.1 | 64 | 0.312 | 119 |
E10000032 | 0.288 | 0.351 | 115 | 118 | 0.161 | 99 | 0.351 | 123 |
E10000034 | 0.245 | 0.302 | 110 | 113 | 0.107 | 89 | 0.325 | 121 |
```

Appendix 4: Baseline measurements of component parts of CHI for future evaluation against.

```
X90820 | 7.702 | 24.74 | 22.99 | 0.311 | 10.4 | 47.1 |
X90832 | 41.63 | 124.8 | 117.9 | 0.334 | 51.49 | 272.6 |
X91116 | 11.22 | 48.41 | 47.74 | 0.232 | 17 | 100 |
X91126 | 1.475 | 4.675 | 4.55 | 0.316 | 1.7 | 10.3 |
X91133 | 2.61 | 3.852 | 3.333 | 0.678 | 0.714 | 13.3 |
X91307 | 9971 | 17441 | 13983 | 0.572 | 8021 | 59480 |
X91463 | 77.34 | 143.5 | 125.1 | 0.539 | 38.52 | 575.2 |
X91524 | 11.63 | 75.98 | 79.34 | 0.153 | 30.48 | 91.94 |
X92196 | 1.167 | 3.826 | 3.59 | 0.305 | 1.742 | 8.053 |
X92447 | 8.075 | 39.13 | 39.62 | 0.206 | 18.16 | 54.89 |
X92477 | 55.55 | 162.4 | 161.9 | 0.342 | 56.94 | 297.3 |
X92543 | 9.696 | 91.06 | 93.7 | 0.106 | 56.9 | 102.4 |
X92785 | 2.296 | 94.46 | 94.8 | 0.024 | 86.3 | 98.8 |
X92899 | 4.157 | 22.24 | 21.45 | 0.187 | 13.3 | 33.9 |
X93131 | 8.061 | 19.39 | 19.52 | 0.416 | 1.29 | 36.21 |
X93175 | 11 | 56.75 | 55.84 | 0.194 | 32.03 | 100.2 |
X93376 | 2.455 | 14.06 | 13.89 | 0.175 | 8.974 | 19.85 |
X93469 | 9.129 | 87.87 | 90.07 | 0.104 | 33.15 | 98.95 |
X93470 | 14.92 | 84.98 | 89.01 | 0.176 | 14.09 | 112.7 |
X93471 | 15.86 | 84.04 | 88.63 | 0.189 | 9.955 | 99.78 |
X93472 | 16.42 | 77.39 | 80.47 | 0.212 | 0.939 | 101.1 |
X93494 | 3.278 | 82.27 | 82.4 | 0.04 | 74.31 | 94.8 |
X212 | 0.49 | 1.731 | 1.777 | 0.283 | 0.719 | 2.674 |
X219 | 2.364 | 13.83 | 14 | 0.171 | 7.482 | 18.04 |
X848 | 2.099 | 9.835 | 9.747 | 0.213 | 5.375 | 15.57 |
X1203 | 15.6 | 60.03 | 58.64 | 0.26 | 33.52 | 106.6 |
X11001 | 11.76 | 37.94 | 36.19 | 0.31 | 16.99 | 79.62 |
X20601 | 2.887 | 22.52 | 22.59 | 0.128 | 13.92 | 29.62 |
X20602 | 4.367 | 34.81 | 34.67 | 0.125 | 21.71 | 44.5 |
X30101 | 1.026 | 5.092 | 5.023 | 0.202 | 3.109 | 7.029 |
X90804 | 7.974 | 17.11 | 15.69 | 0.466 | 2.584 | 41.66 |
X91163 | 1.937 | 12.16 | 12.05 | 0.159 | 7.38 | 16.78 |
X91164 | 1.356 | 10.6 | 10.48 | 0.128 | 6.711 | 15.23 |
X91414 | 139.1 | 651.4 | 637.4 | 0.214 | 393.8 | 1097 |
```

```
X92443 | 2.971 | 15.16 | 14.94 | 0.196 | 8.131 | 23.07 |
X92527 | 0.207 | 2.415 | 2.385 | 0.086 | 2.01 | 3.26 |
X92588 | 2.365 | 9.9 | 9.884 | 0.239 | 4.198 | 15.28 |
X92904 | 17.85 | 34.95 | 32.72 | 0.511 | 6.754 | 106.5 |
X93014 | 5.005 | 65.25 | 65.8 | 0.077 | 53.34 | 78.02 |
X93077 | 4.779 | 56.94 | 56.91 | 0.084 | 45.73 | 68.76 |
X93088 | 5.865 | 61.61 | 62.19 | 0.095 | 40.47 | 74.95 |
X93347 | 8.023 | 77.08 | 78.24 | 0.104 | 54.31 | 97.46 |
X20101 | 0.64 | 2.845 | 2.77 | 0.225 | 1.57 | 5.3 |
X40401 | 17.51 | 77.34 | 75.57 | 0.226 | 43.98 | 133.4 |
X40602 | 5.441 | 17.71 | 16.68 | 0.307 | 9.513 | 43.03 |
X40702 | 7.795 | 20.66 | 19.65 | 0.377 | 7.48 | 46.4 |
X41001 | 2.156 | 9.879 | 9.492 | 0.218 | 6.054 | 17.93 |
X41101 | 1.067 | 11.85 | 11.91 | 0.09 | 8.81 | 14.53 |
X41201 | 42.65 | 108.7 | 107.6 | 0.392 | 11.69 | 299.9 |
X41202 | 7.628 | 13.82 | 12.43 | 0.552 | -1.96 | 70.29 |
X41204 | 15.77 | 41.61 | 40.57 | 0.379 | 6.318 | 130 |
X41402 | 43.5 | 252.1 | 245.2 | 0.173 | 157.5 | 382.3 |
X41403 | 224.7 | 1526 | 1533 | 0.147 | 934.4 | 2404 |
X90287 | 0.355 | 1.154 | 1.126 | 0.308 | 0.394 | 2.488 |
X90360 | 7.403 | 21.34 | 21.33 | 0.347 | -2.78 | 42.41 |
X90361 | 10.27 | 30.8 | 30.17 | 0.333 | 5.325 | 72.16 |
X90641 | 4.069 | 20.74 | 20.71 | 0.196 | 4.348 | 34.38 |
X90642 | 5.847 | 29.45 | 29.36 | 0.199 | 11.11 | 44.46 |
X91096 | 77.92 | 374.7 | 366.8 | 0.208 | 164.8 | 570.4 |
X91195 | 0.03 | 0.73 | 0.733 | 0.041 | 0.634 | 0.793 |
X92196 | 1.167 | 3.826 | 3.59 | 0.305 | 1.742 | 8.053 |
X92326 | 3.284 | 11.54 | 11.26 | 0.285 | 5.345 | 20.61 |
X92327 | 1.848 | 5.383 | 5.053 | 0.343 | 2.682 | 14.5 |
X92441 | 7.677 | 75.07 | 76.51 | 0.102 | 52.9 | 93.59 |
X92718 | 132.8 | 1137 | 1135 | 0.117 | 767.3 | 1550 |
X92724 | 127.6 | 1126 | 1121 | 0.113 | 834.6 | 1473 |
X92725 | 123.7 | 663 | 642.3 | 0.187 | 412.4 | 973.9 |
X92949 | 7.331 | 69.35 | 68.75 | 0.106 | 52.5 | 90.2 |
```

```
<!-- Footnotes themselves at the bottom. -->
```

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