

IHDS Assessment 2: Report

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Research topic:

Analysing trends and variations in emergency department activities across Scottish health boards: an analysis of patient attendance, waiting time, and hospitalisations (2015-2023).

Introduction

The emergency department (ED) is a vital component of healthcare systems and one of the most important wards in a hospital, providing immediate clinical and paraclinical care to individuals injured in accidents and incidents (Ajami et al., 2012). The primary duty of the emergency department is to provide medical attention in high-risk situations. Seconds and minutes matter greatly for patients in the ED. These periods could determine how long it takes for someone to pass away, become seriously disabled, or survive (Ajami et al., 2012; Spechbach et al., 2019). However, one of the key components of healthcare management is the length of time patients must wait in the emergency room. This is among the variables that determine patient satisfaction and one of the metrics used to assess the quality of emergency services (Spechbach et al., 2019). In the United Kingdom, the goal for all member states is that for 95% of patients to be admitted, released, or moved from A&E departments in less than four hours. This is regarded as a safety target, supported by data showing worse outcomes after prolonged waits of more than 6–12 hours (Royal College of Emergency Medicine (RCEM), 2021).

Prior to the COVID-19 outbreak, Scottish EDs appeared to already be experiencing high patient attendance rates, leading to increased pressure on resources and staff. There were concerns about long waiting times, with many patients waiting beyond the four-hour target (RCEM, 2021). At the onset of the pandemic, there was a significant drop in ED attendances as people avoided hospitals due to fear of infection (Mulholland et al., 2020).

After lockdown measures were lifted, there was a sudden surge in ED attendances, overwhelming the system and leading to longer waiting times. Implementing COVID-19 infection control measures strained resources further, as additional space and staff were needed to manage both COVID-19 and non-COVID-19 patients. Many healthcare staff were redeployed to manage COVID-19 cases, reducing the workforce available for other emergency care (Scottish Government, 2022).

Post-COVID-19, there seems to be persistent high attendance. Indeed, attendance rates have returned to pre-pandemic levels or even higher, continuing to put pressure on EDs. Waiting times appear to have increased, with a significant number of patients waiting beyond the four-hour target, according to the RCEM (2021). Therefore, evaluating activities within EDs, including patient attendance, waiting times, and hospitalisations across the 14 Scottish health boards, offers valuable insights into healthcare performance and resource allocation. This study aims to analyse these factors across Scottish health boards over a nine-year period from 2015 to 2023, identifying trends, disparities, and potential areas for improvement.

To achieve our research objectives, we have outlined two specific aims:

- *Specific aim 1:* Evaluate trends in waiting times and patient attendance in emergency departments across Scottish Health Boards from 2015 to 2023 and their impact on overall healthcare performance and patient outcomes.
- *Specific Aim 2:* Identify variations in emergency hospitalisations across different Scottish health boards over years.

Data handling and visualisation in R

Load packages

```
library(tidyverse)
library(viridis)      # For pretty color scales in our graphs.
library(hrbrthemes)   # For additional themes, theme components, and utilities for ggplot.
library(showtext)     # For custom fonts in our graphs.
library(grid)         # For complex layouts in our plots
library(ggiraph)      # For custom annotations
```

Setting up fonts

To enhance the visual appeal of our graphs, we add some custom fonts with the package “showtext”. Custom fonts are added with the function `font_add()`, then called with `showtext_auto()`.

```
font_add(family = "MarkerFelt", regular = "/Library/Fonts/MarkerFelt.ttc")
font_add(family = "AmericanTypewriter",
         regular = "/Library/Fonts/Supplemental/AmericanTypewriter.ttc")
font_add(family = "Charter",
         regular = "/Library/Fonts/Supplemental/Charter.ttc")
font_add(family = "Arial Rounded Bold",
         regular = "/Library/Fonts/Supplemental/Arial Rounded Bold.ttf")
showtext_auto()
```

Loading the data

Our datasets are loaded directly from our project folder.

The first dataset is from the Scottish Public Health Observatory (ScotPHO) website. It includes yearly emergency patient hospitalisations (Age-sex standardised rate per 100,000) registered from 2003 to 2021 in Scottish health boards (ScotPHO profiles, 2024). The name **hospitalisation** was assigned to this dataset.

The second dataset is from the Public Health Scotland NHS Performs website, providing weekly updates on emergency department activity and waiting time statistics from 2015 to 2023 (Public Health Scotland, 2023). The name **performs** was assigned to this one.

The data is saved in csv files, so we will use the `read.csv()` function.

```
hospitalisation <- read_csv("ScotPHO.csv")
performs <- read_csv("NHS Performs.csv")
```

Inspection of data

We will inspect data with `head()`, `glimpse()` and `summary()` functions to get an idea of the data we are dealing with.

```
head(performs, 10)
```

```
## # A tibble: 10 x 12
##   week_ending_date nhs_board_cypher nhs_board_name location_code location_name
##   <date>           <chr>           <chr>           <chr>           <chr>
## 1 2015-02-22      A             NHS Ayrshire &~ A             NHS Ayrshire~
## 2 2015-02-22      B             NHS Borders      B             NHS Borders
## 3 2015-02-22      Y             NHS Dumfries &~ Y             NHS Dumfries~
## 4 2015-02-22      F             NHS Fife         F             NHS Fife
## 5 2015-02-22      V             NHS Forth Vall~ V             NHS Forth Va~
## 6 2015-02-22      N             NHS Grampian     N             NHS Grampian
## 7 2015-02-22      G             NHS Greater Gl~ G             NHS Greater ~
## 8 2015-02-22      H             NHS Highland     H             NHS Highland
## 9 2015-02-22      L             NHS Lanarkshire L             NHS Lanarksh~
## 10 2015-02-22     S             NHS Lothian      S             NHS Lothian
## # i 7 more variables: attendance <dbl>, number_over_4_hours <dbl>,
## #   percentage_within_4_hours <dbl>, number_over_8_hours <dbl>,
## #   percentage_within_8_hours <dbl>, number_over_12_hours <dbl>,
## #   percentage_within_12_hours <dbl>
```

```
glimpse(performs)
```

```
## Rows: 5,992
## Columns: 12
## $ week_ending_date      <date> 2015-02-22, 2015-02-22, 2015-02-22, 2015-0~
## $ nhs_board_cypher      <chr> "A", "B", "Y", "F", "V", "N", "G", "H", "L"~
## $ nhs_board_name        <chr> "NHS Ayrshire & Arran", "NHS Borders", "NHS~
## $ location_code         <chr> "A", "B", "Y", "F", "V", "N", "G", "H", "L"~
## $ location_name         <chr> "NHS Ayrshire & Arran", "NHS Borders", "NHS~
## $ attendance            <dbl> 2161, 517, 800, 1284, 1095, 1877, 7579, 950~
## $ number_over_4_hours    <dbl> 422, 54, 37, 149, 42, 196, 1823, 47, 524, 2~
## $ percentage_within_4_hours <dbl> 80.5, 89.6, 95.4, 88.4, 96.2, 89.6, 75.9, 9~
## $ number_over_8_hours    <dbl> 52, 1, 1, 22, 0, 38, 463, 1, 120, 34, 0, 0,~
## $ percentage_within_8_hours <dbl> 97.6, 99.8, 99.9, 98.3, 100.0, 98.0, 93.9, ~
## $ number_over_12_hours    <dbl> 4, 0, 0, 7, 0, 4, 127, 0, 45, 0, 0, 0, 0~
## $ percentage_within_12_hours <dbl> 99.8, 100.0, 100.0, 99.5, 100.0, 99.8, 98.3~
```

```
summary(performs)
```

```
## week_ending_date      nhs_board_cypher    nhs_board_name      location_code
## Min.      :2015-02-22 Length:5992          Length:5992          Length:5992
## 1st Qu.   :2017-03-10 Class :character     Class :character     Class :character
## Median    :2019-03-27 Mode  :character     Mode  :character     Mode  :character
## Mean      :2019-03-27
## 3rd Qu.   :2021-04-12
## Max.      :2023-04-30
## location_name          attendance      number_over_4_hours
## Length:5992            Min.      : 38.0    Min.      : 0.00
## Class :character       1st Qu.: 557.8    1st Qu.: 22.75
## Mode  :character       Median :1230.0    Median : 97.00
```

```
##           Mean :1784.7   Mean : 256.35
##           3rd Qu.:2103.2   3rd Qu.: 283.25
##           Max. :7843.0   Max. :3667.00
## percentage_within_4_hours number_over_8_hours percentage_within_8_hours
## Min. : 37.20           Min. : 0.00           Min. : 65.50
## 1st Qu.: 86.00           1st Qu.: 0.00           1st Qu.: 98.30
## Median : 92.80           Median : 5.00           Median : 99.60
## Mean : 88.85           Mean : 50.65           Mean : 97.86
## 3rd Qu.: 96.20           3rd Qu.: 37.00           3rd Qu.:100.00
## Max. :100.00           Max. :1421.00           Max. :100.00
## number_over_12_hours percentage_within_12_hours
## Min. : 0.00           Min. : 79.80
## 1st Qu.: 0.00           1st Qu.: 99.70
## Median : 0.00           Median :100.00
## Mean : 17.01           Mean : 99.21
## 3rd Qu.: 5.00           3rd Qu.:100.00
## Max. :670.00           Max. :100.00
```

```
head(hospitalisation, 10)
```

```
## # A tibble: 10 x 11
##   area_code area_type area_name year period type_definition indicator
##   <chr> <chr> <chr> <dbl> <chr> <chr> <chr>
## 1 S08000015 Health board NHS Ayrshire &~ 2003 2002 ~ Age-sex standa~ Emergenc~
## 2 S08000016 Health board NHS Borders 2003 2002 ~ Age-sex standa~ Emergenc~
## 3 S08000017 Health board NHS Dumfries &~ 2003 2002 ~ Age-sex standa~ Emergenc~
## 4 S08000019 Health board NHS Forth Vall~ 2003 2002 ~ Age-sex standa~ Emergenc~
## 5 S08000020 Health board NHS Grampian 2003 2002 ~ Age-sex standa~ Emergenc~
## 6 S08000022 Health board NHS Highland 2003 2002 ~ Age-sex standa~ Emergenc~
## 7 S08000024 Health board NHS Lothian 2003 2002 ~ Age-sex standa~ Emergenc~
## 8 S08000025 Health board NHS Orkney 2003 2002 ~ Age-sex standa~ Emergenc~
## 9 S08000026 Health board NHS Shetland 2003 2002 ~ Age-sex standa~ Emergenc~
## 10 S08000028 Health board NHS Western Is~ 2003 2002 ~ Age-sex standa~ Emergenc~
## # i 4 more variables: numerator <dbl>, measure <dbl>,
## # upper_confidence_interval <dbl>, lower_confidence_interval <dbl>
```

```
glimpse(hospitalisation)
```

```
## Rows: 266
## Columns: 11
## $ area_code <chr> "S08000015", "S08000016", "S08000017", "S080~
## $ area_type <chr> "Health board", "Health board", "Health boar~
## $ area_name <chr> "NHS Ayrshire & Arran", "NHS Borders", "NHS ~
## $ year <dbl> 2003, 2003, 2003, 2003, 2003, 2003, 2003, 20~
## $ period <chr> "2002 to 2004 calendar years; 3-year aggrega~
## $ type_definition <chr> "Age-sex standardised rate per 100,000", "Ag~
## $ indicator <chr> "Emergency patient hospitalisations", "Emerg~
## $ numerator <dbl> 27042.0, 7888.0, 9264.0, 17917.3, 33841.7, 2~
## $ measure <dbl> 7768.3, 7458.3, 6381.6, 6965.0, 7005.0, 7334~
## $ upper_confidence_interval <dbl> 7865.3, 7630.5, 6516.9, 7073.1, 7083.7, 7437~
## $ lower_confidence_interval <dbl> 7672.1, 7288.9, 6248.3, 6858.0, 6927.0, 7232~
```

```
summary(hospitalisation)
```

```
## area_code area_type area_name year
## Length:266 Length:266 Length:266 Min. :2003
```

```
## Class :character   Class :character   Class :character   1st Qu.:2007
## Mode  :character   Mode  :character   Mode  :character   Median :2012
##                                     Mean  :2012
##                                     3rd Qu.:2017
##                                     Max.  :2021
##      period          type_definition      indicator          numerator
## Length:266          Length:266          Length:266          Min.   : 1201
## Class :character     Class :character     Class :character     1st Qu.: 8922
## Mode  :character     Mode  :character     Mode  :character     Median :23629
##                                     Mean  :27027
##                                     3rd Qu.:35071
##                                     Max.  :96596
##      measure          upper_confidence_interval lower_confidence_interval
## Min.   : 5352         Min.   : 5666                Min.   :5050
## 1st Qu.: 6668         1st Qu.: 6845                1st Qu.:6537
## Median : 7053         Median : 7190                Median :6937
## Mean   : 7238         Mean   : 7387                Mean   :7094
## 3rd Qu.: 7894         3rd Qu.: 8038                3rd Qu.:7753
## Max.   :10051         Max.   :10154                Max.   :9948
```

Both datasets seem to be clean, with no missing data. However, we just noticed that the time is in a full date format in the dataset called *performs* while it is in year in the one called *hospitalisation*. We can then go to the next steps.

Data visualisation

Specific aim 1: Evaluate trends in waiting times and patient attendance in emergency departments across Scottish Health Boards from 2015 to 2023 and their impact on overall healthcare performance and patient outcomes. Bar graph of waiting time (4 hours) in 2023

Let's plot a bar chart showing the Emergency Department attendances that were seen and resulted in a subsequent admission, transfer or discharge within 4 hours in 2023.

We will first create a summary table called **median_waiting** with the median of the column *percentage_within_4_hours* for each NHS_board in 2023 from the “performs” dataset. Then, we will plot a bar chart that includes a vertical line indicating the **national standard** for Accident & Emergency (A&E) services in the UK, which has been set at **95%** since 2007. This standard means that 95% of patients should wait no longer than 4 hours from their arrival to either admission, discharge, or transfer in A&E (Public Health Scotland, 2023).

```
# compute median of percentage_within_4_hours first
median_waiting <- performs %>%
  filter(format(week_ending_date, "%Y") == "2023") %>%
  group_by(nhs_board_name) %>%
  summarise(median = median(percentage_within_4_hours))

# Let's plot a bar graph
bar_waiting <- median_waiting %>%
  ggplot(aes(reorder(nhs_board_name, median), median, fill = nhs_board_name)) +
  geom_col(width = 0.7 , alpha = 0.7) +
  scale_fill_manual(values = viridis(15)) +
  geom_hline_interactive(aes(yintercept = 95), color = "orange", size = 1) +
```

```

coord_flip() +

# let's customize layout now
theme_classic() +

labs(x = "NHS boards",
     y = "Patients seen within 4 hours (%)",
     title = "Scottish ED performance",
     subtitle = "ED attendances seen within 4 hours in 2023 VS national standard (95%)") +

theme(legend.position = "none",
      axis.title.x = element_text(margin = margin(t = 10)),
      axis.title.y = element_text(margin = margin(t = 20)),
      plot.title = element_text(family = "Arial Rounded Bold",
                                face = "bold",
                                size = 16),
      plot.subtitle = element_text(family = "Arial Rounded Bold",
                                   size = 11),
      panel.grid.major.x = element_line(color = "gray", linewidth = 0.1),
      text = element_text(family = "Arial Rounded Bold"),
      axis.line.x.bottom = element_blank(),
      axis.ticks.length = unit(0, "mm"),
      axis.text.y = element_blank(),
      axis.text.x = element_text(size = 11,
                                  family = "MarkerFelt",
                                  margin = margin(r = 10))) +

scale_y_continuous(expand = c(0, 0),
                   limits = c(0, 101),
                   breaks = seq(0, 100, by = 10)) +

geom_text(aes(nhs_board_name, label = nhs_board_name),
          hjust = 1,
          family = "Charter",
          size = 4) +

# We are now adding up some annotations
annotate(geom = "label",
         x = 7.5,
         y = 95,
         label = "95%",
         family = "MarkerFelt", colour = "orange") +

theme(plot.margin = margin(0.05, 0.02, 0.05, 0.03, "npc")) # specifies the margins around the plot

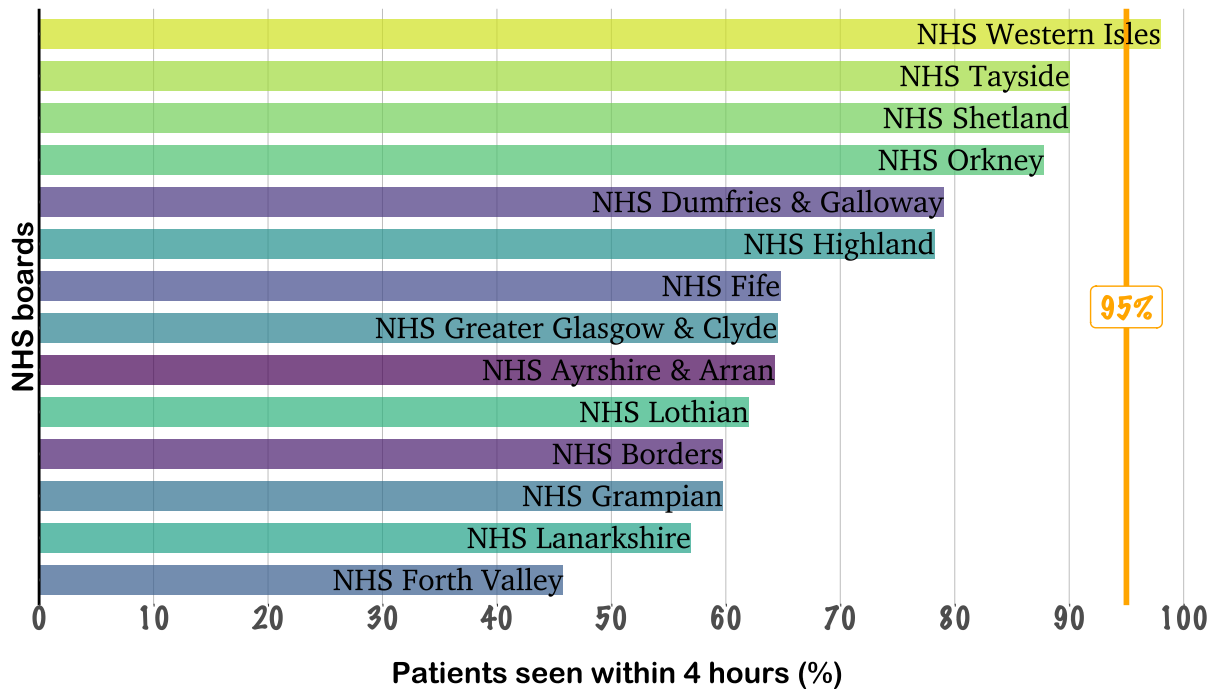
bar_waiting

# Let's add a black line at the top of the graph to make it look cool.
grid.lines(x = c(0, 4), y = 1,
           gp = gpar(col = "black", lwd = 3))
grid.rect(x = 0, y = 1, width = 0.05, height = 0.025,
          just = c("left", "top"), gp = gpar(fill = "black", lwd = 0))

```

Scottish ED performance

ED attendances seen within 4 hours in 2023 VS national standard (95%)



In the previous graph, it can be observed that only the **NHS Western Isles** health board achieved the goal of 95% of patients being seen within 4 hours, while **NHS Forth Valley** failed to reach even 50%.

Next, let's create a line graph to illustrate the trend of emergency department (ED) attendances over the years from 2015 to 2023 for both the *NHS Western Isles* and *NHS Forth Valley* health boards.

```
BLUE <- "#076fa2"
GREEN <- "#01796F" # Define the colors we will be using.

line.graph <- performs %>%
  filter(nhs_board_name %in% c("NHS Western Isles", "NHS Forth Valley")) %>%
  group_by(nhs_board_name, week_ending_date) %>%
  ggplot(aes(week_ending_date, attendance, color = nhs_board_name)) +
  geom_line() +
  scale_color_manual(values = c(BLUE, GREEN)) +

# let's customise the layout now
theme_classic() +
labs(title = "NHS Western Isles vs NHS Forth Valley",
     subtitle = "Weekly ED attendances from 2015 to 2023",
     x = "Time (years)",
     y = "Weekly attendances") +
theme(text = element_text(family = "Arial Rounded Bold"),
     legend.position = "none",
```

```

panel.grid.major.x = element_line(color = "gray", linewidth = 0.1, linetype = "dashed"),
panel.grid.major.y = element_line(color = "gray", linewidth = 0.1, linetype = "dashed"),
plot.title = element_text(face = "bold",
                           size = 16, color = "red"),
plot.subtitle = element_text(size = 11),

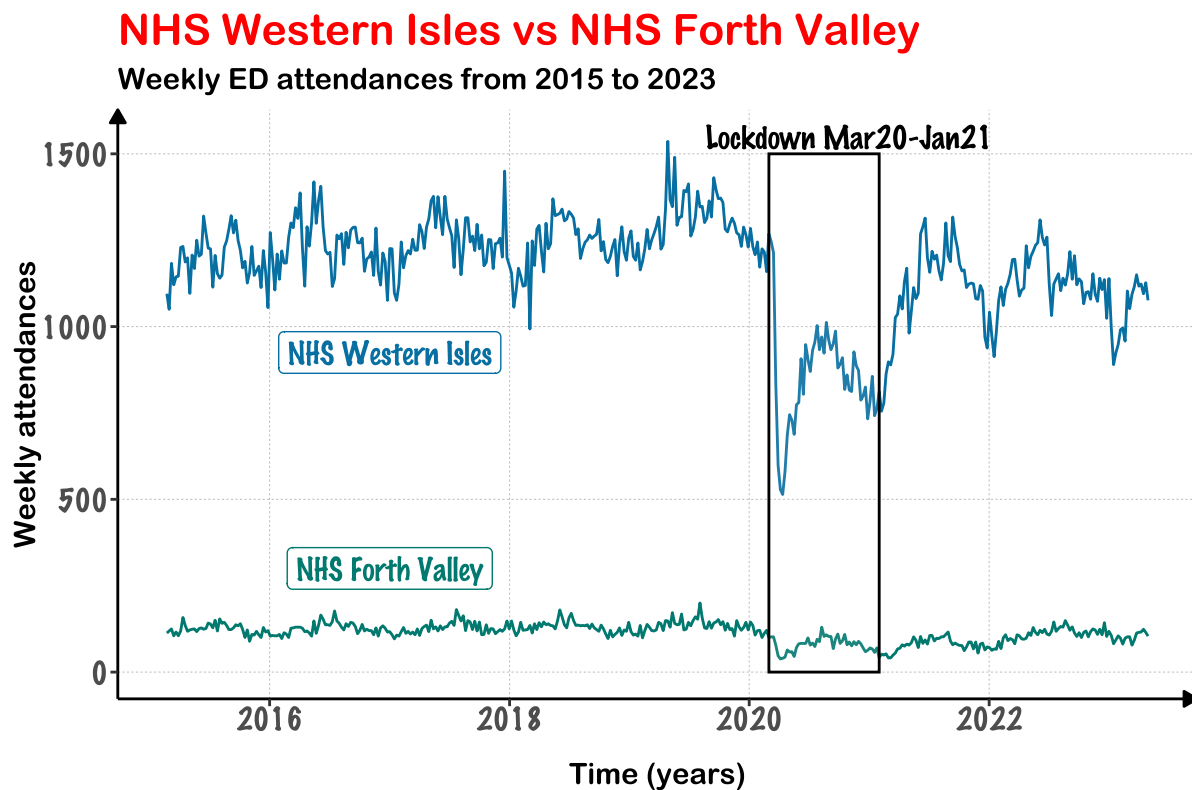
axis.title.x = element_text(margin = margin(t = 10)),
axis.title.y = element_text(margin = margin(t = 20)),
axis.text.x = element_text(size = 11, family = "MarkerFelt", margin = margin(r = 1)),
axis.text.y = element_text(size = 11, family = "MarkerFelt", margin = margin(r = 1)),
scale_y_continuous(expand = c(0, 0),
                   limits = c(0, 203),
                   breaks = seq(0, 200, by = 25)),
axis.line = element_line(arrow = arrow(length = unit(0.2, "cm"), type = "closed" ))) +

# We are now adding up some annotations
annotate(geom = "rect",
         xmin = as.Date("2020-03-01"), xmax = as.Date("2021-01-31"),
         ymin = 0, ymax = 1500,
         fill = "white", alpha = 0.1,
         colour = "black") +
annotate(geom = "text",
         x = as.Date("2020-11-01"),
         y = 1550,
         label = "Lockdown Mar20-Jan21",
         family = "MarkerFelt") +
annotate(geom = "label",
         x = as.Date("2017-01-01"),
         y = 925,
         label = "NHS Western Isles",
         family = "MarkerFelt",
         colour = BLUE) +
annotate(geom = "label",
         x = as.Date("2017-01-01"),
         y = 300,
         label = "NHS Forth Valley",
         family = "MarkerFelt",
         colour = GREEN) +
theme(plot.margin = margin(0.05, 0.02, 0.05, 0.03, "npc")) # specifies the margins around the plot

line.graph

# Let's add a black line at the top of the graph to make it look cool.
grid.lines(x = c(0, 4), y = 1,
           gp = gpar(col = "black", lwd = 3))
grid.rect(x = 0, y = 1, width = 0.05, height = 0.025,
          just = c("left", "top"), gp = gpar(fill = "black", lwd = 0))

```

Specific Aim 2: Identify variations in emergency hospitalisations across different Scottish health boards over years.

We are comparing emergency hospitalisations across all Scottish health boards in 2015 and 2021.

First, let's calculate the average emergency hospitalisations for each Scottish NHS board from the **hospitalisation** dataset annually and create a summary table called *mean_hosp*.

```
mean_hosp <- hospitalisation %>%
  group_by(year, area_name) %>%
  summarise(mean_hospitalisation = mean(measure))
```

```
mean_hosp %>% head()
```

```
## # A tibble: 6 x 3
## # Groups:   year [1]
##   year area_name      mean_hospitalisation
##   <dbl> <chr>          <dbl>
## 1  2003 NHS Ayrshire & Arran      7768.
## 2  2003 NHS Borders              7458.
## 3  2003 NHS Dumfries & Galloway    6382.
```

## 4	2003 NHS Fife	6836.
## 5	2003 NHS Forth Valley	6965
## 6	2003 NHS Grampian	7005

Let's plot a bar chart comparing ED hospitalisation in 2015 and 2021 across Scottish Health Boards and call it `bar_hosp`.

```
bar_hosp <- mean_hosp %>%
  filter(year %in% c(2015, 2021)) %>%
  ggplot(aes(reorder(area_name, mean_hospitalisation), mean_hospitalisation, fill = as.factor(year))) +
  geom_bar(stat = "identity", position = "dodge", width = 0.7) +
  scale_fill_manual(values = viridis(4)) +

# let's customise the layout now
theme_classic() +
labs(y = "Rate (/100,000 pop.)",
     title = "Scottish health boards",
     subtitle = "ED hospitalisation age-sex standardised rate registered in 2015 and 2021",
     fill = "Years") +
xlab(element_blank()) +
theme(legend.position = "right",
      legend.title = element_text(size = 10, face = "bold"),
      axis.text.x = element_text(angle = 34, hjust = 1, size = 11, family = "MarkerFelt", margin = margin(r = 10)),
      axis.title.x = element_text(margin = margin(t = 10)),
      axis.title.y = element_text(margin = margin(t = 20)),
      plot.title = element_text(family = "Arial Rounded Bold", face = "bold", size = 16, colour = "red"),
      plot.subtitle = element_text(family = "Arial Rounded Bold", size = 11),
      panel.grid.major.y = element_line(color = "gray", linewidth = 0.3),
      text = element_text(family = "Arial Rounded Bold"),
      plot.margin = margin(0.05, 0, 0, 0.015, "npc")) + # specifies the margins around the plot

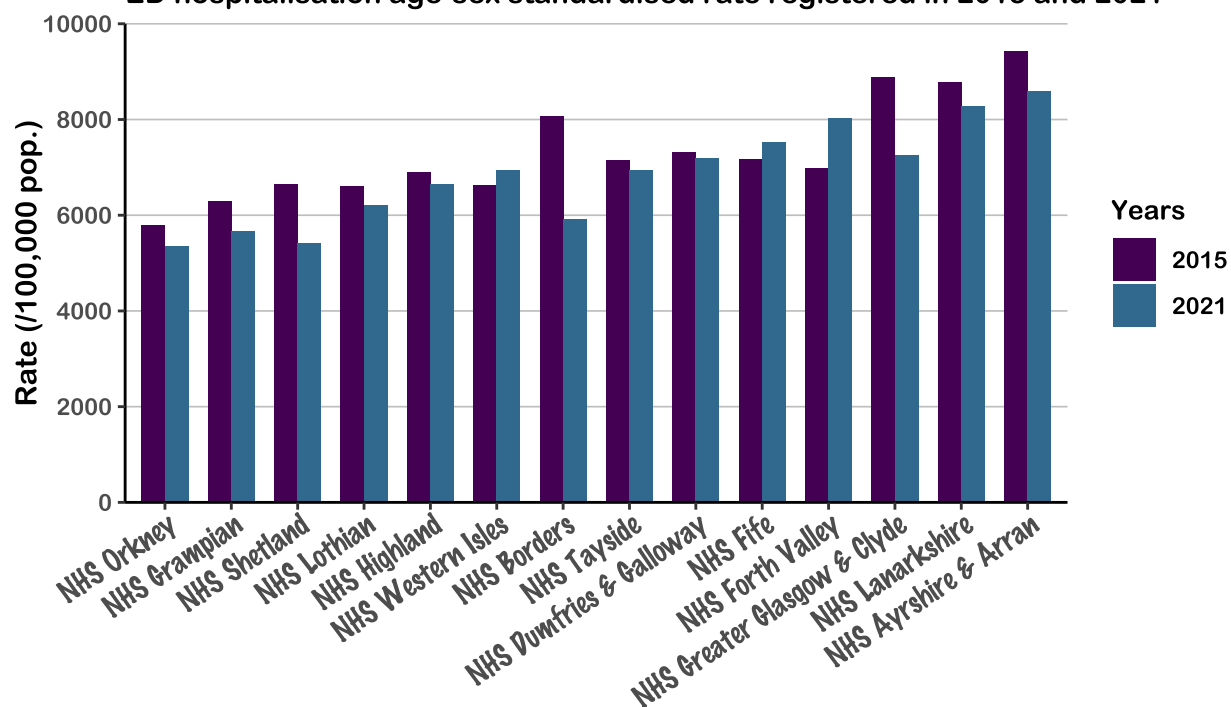
scale_y_continuous(expand = c(0, 0),
                   limits = c(0, 10000),
                   breaks = seq(0, 10000, by = 2000)) # Set y-axis scale

bar_hosp

# Let's add a black line at the top of the graph to make it look cool.
grid.lines(x = c(0, 4),
           y = 1,
           gp = gpar(col = "black", lwd = 3))
grid.rect(x = 0, y = 1, width = 0.05, height = 0.025,
          just = c("left", "top"), gp = gpar(fill = "black", lwd = 0))
```

Scottish health boards

ED hospitalisation age-sex standardised rate registered in 2015 and 2021



Summary

Our target audience includes Public Health officers, hospital managers, and emergency department heads. These stakeholders can utilise the data to enhance patient flow, reduce waiting times, and improve overall hospital efficiency. Additionally, Public Health officers can analyse the data to identify trends, find areas needing improvement in ED organisation, and develop strategies to address public health challenges.

The primary objective of our graphs is to illustrate the performance of Emergency Departments in NHS Scotland health boards relative to the national standard, which mandates that 95% of patients should wait no longer than 4 hours from arrival to admission, discharge, or transfer for A&E treatment (Public Health Scotland, 2023).

To create our visualisations, we utilised two datasets:

- **Scottish Public Health Observatory (ScotPHO) Dataset:** This dataset includes yearly emergency patient hospitalisations from 2003 to 2021 across Scottish health boards. It was selected by choosing ‘health board’ as the dataset type, ‘health and well-being’ as the profile, and ‘emergency patient hospitalisations’ as the indicator, covering all years of interest (ScotPHO profiles, 2024).
- **Public Health Scotland Dataset:** This dataset provides weekly updates on emergency department activity and waiting time statistics from 2015 to 2023 (Public Health Scotland, 2023).

Data limitations

- The datasets originate from two different organisations, potentially leading to variations in data collection methods.
- The NHS Performs dataset collects data weekly from 2015 to 2023, whereas the ScotPHO dataset provides yearly data, presented as a 3-year rolling average and age-sex standardised rate per 100,000 population.
- The data is not at the population level, making individual-level conclusions challenging.

Strengths and limitations of our approach

Our visualisation approach has both strengths and limitations. Bar graphs allowed us to compare emergency waiting times of less than 4 hours and hospitalisations across all NHS Scotland Health boards for specific years. However, comparing more than two years proved challenging. Using bar graphs, we highlighted the Emergency Department attendance trend in NHS Western Isles, the only health board where over 95% of patients waited no longer than 4 hours from arrival to admission, discharge, or transfer for A&E treatment. However, presenting trends for all 14 health boards in a single plot was not feasible. While multiple grids or wrapped plots were considered, they were not suitable for such a large number of categories (health boards).

Conclusion

Emergency Departments in NHS Scotland Health boards need significant performance improvements, as only one health board meets the UK national standard of 95%. Additionally, there has been a notable decrease in ED admissions in NHS Western Isles since the COVID-19 outbreak compared to the pre-COVID period. However, the current ED hospitalisation rate in NHS Western Isles appears similar to pre-COVID levels.

References

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