

Equity and Efficiency in Patient Care

~Identifying gaps in care delivery, treatment delays, and demographic disparities to promote equitable and efficient patient care across all populations~

~EQUITABLE HEALTHCARE~

Patient outcomes, access to care, and quality of treatment should not systematically differ because of age, gender, ethnicity, socioeconomic status, disability, or location.

RESEARCH QUESTION:

are some patient groups disadvantaged in access, waiting time, attendance, or outcomes — even when clinical need is similar?

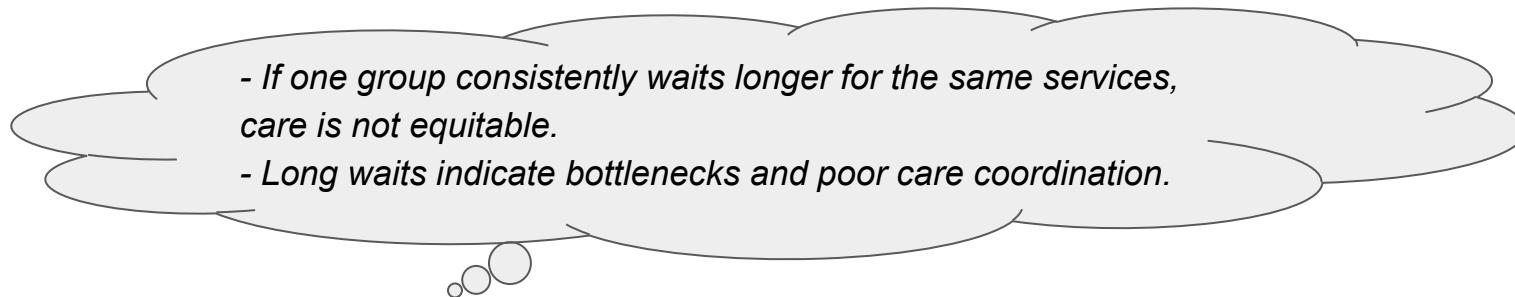
Abstract data from tables using date of birth, gender, registration date and treatment date...

KPI1: wait tme

HOW LONG ARE PATIENTS WAITING FOR THEIR APPOINTMENTS?

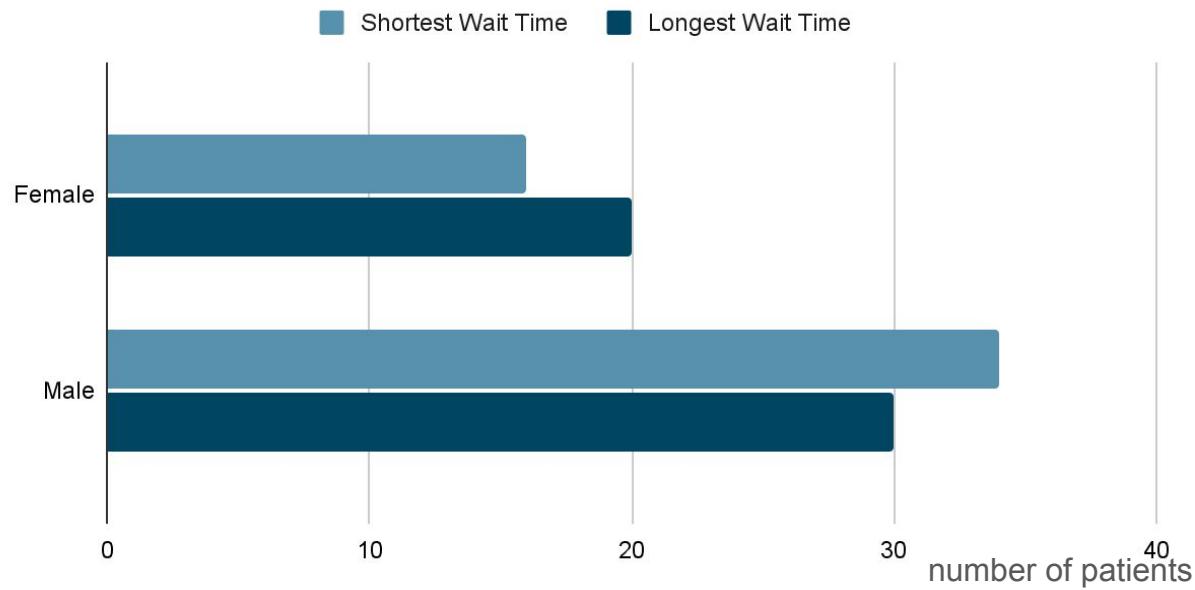
MEASURE: time from referral (registration date) → first appointment (appointment date)

COMPARE: patient demographic



FINDINGS: COMPARISON BY GENDER

Top 50 Patients with Longest and Shortest Wait Time
Gender Demographic

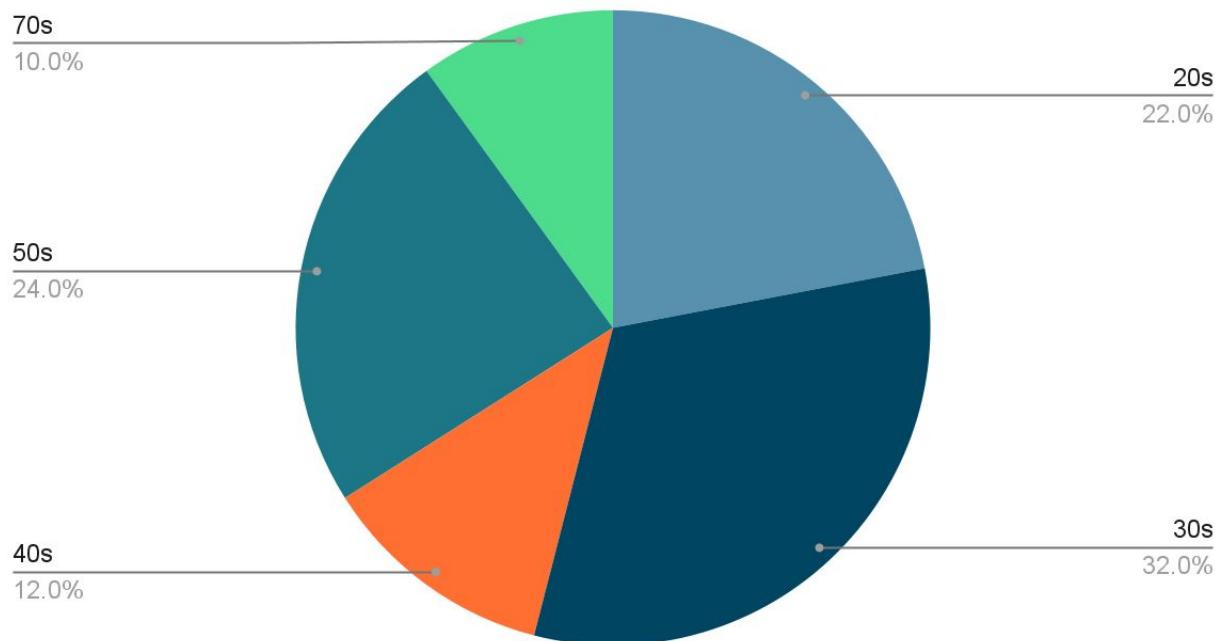


Among the 50 patients with the shortest wait times, males represented a larger proportion (68%) compared to females (32%) whereas among the 50 patients with the longest wait times, the gender distribution was more balanced, with males accounting for 60% and females 40%. This indicates there is a smaller gender gap among patients experiencing the longest waits.

Limiting patients to top 50 to analyse the demographic evenly

FINDINGS: COMPARISON BY AGE GROUP

Shortest Wait Time - Age Demographic

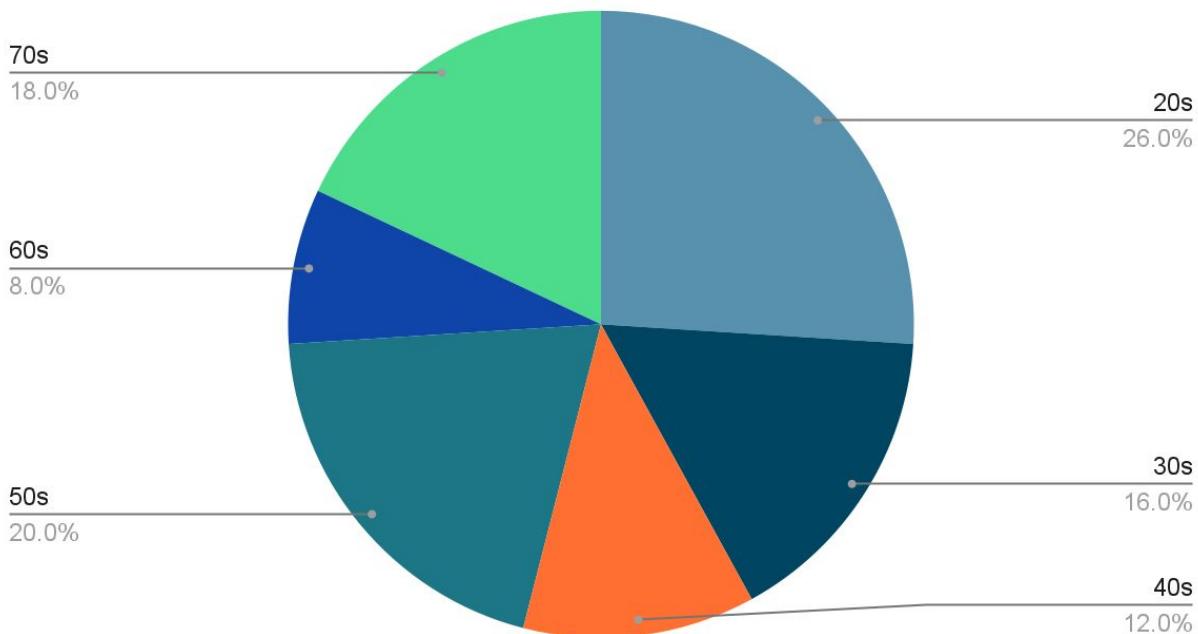


Among the 50 patients with the shortest wait times, the largest portions were in their 30s, 50s, 20s.

Limiting patients to top 50 to analyse the demographic evenly

FINDINGS: COMPARISON BY AGE GROUP

Longest Wait Time - Age Demographic



In contrast, patients in their 20s, 50s, 70s were the largest portions in longest wait time.

Comparison of two cohorts shows a shift in age comparison, with younger adults in their 20s and older adults in their 70s appearing more frequently in the longest wait-time group compared to the shortest wait-time whereas patients in their 30s seem to appear more frequently in the shortest wait times compared to the longest wait-time.

Limiting patients to top 50 to analyse the demographic evenly

KPI2: appointment completion rate

HOW MANY PATIENTS COMPLETED THEIR APPOINTMENTS?

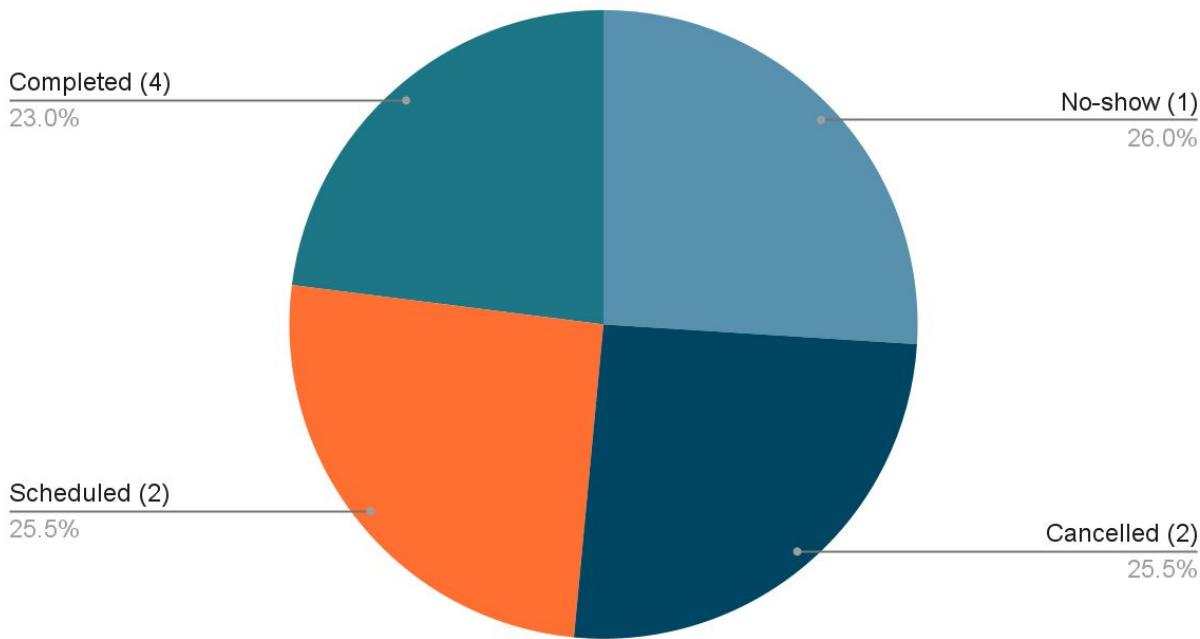
MEASURE: percentage of appointments with each status (cancelled, no-shows, scheduled, completed)

COMPARE: completed appointments to missed appointments and their patient demographics

- Lower completion rates may signal access barriers such as transport, work flexibility, and language.
- Missed appointments waste clinical time and resources.

FINDINGS: STATUS DISTRIBUTION

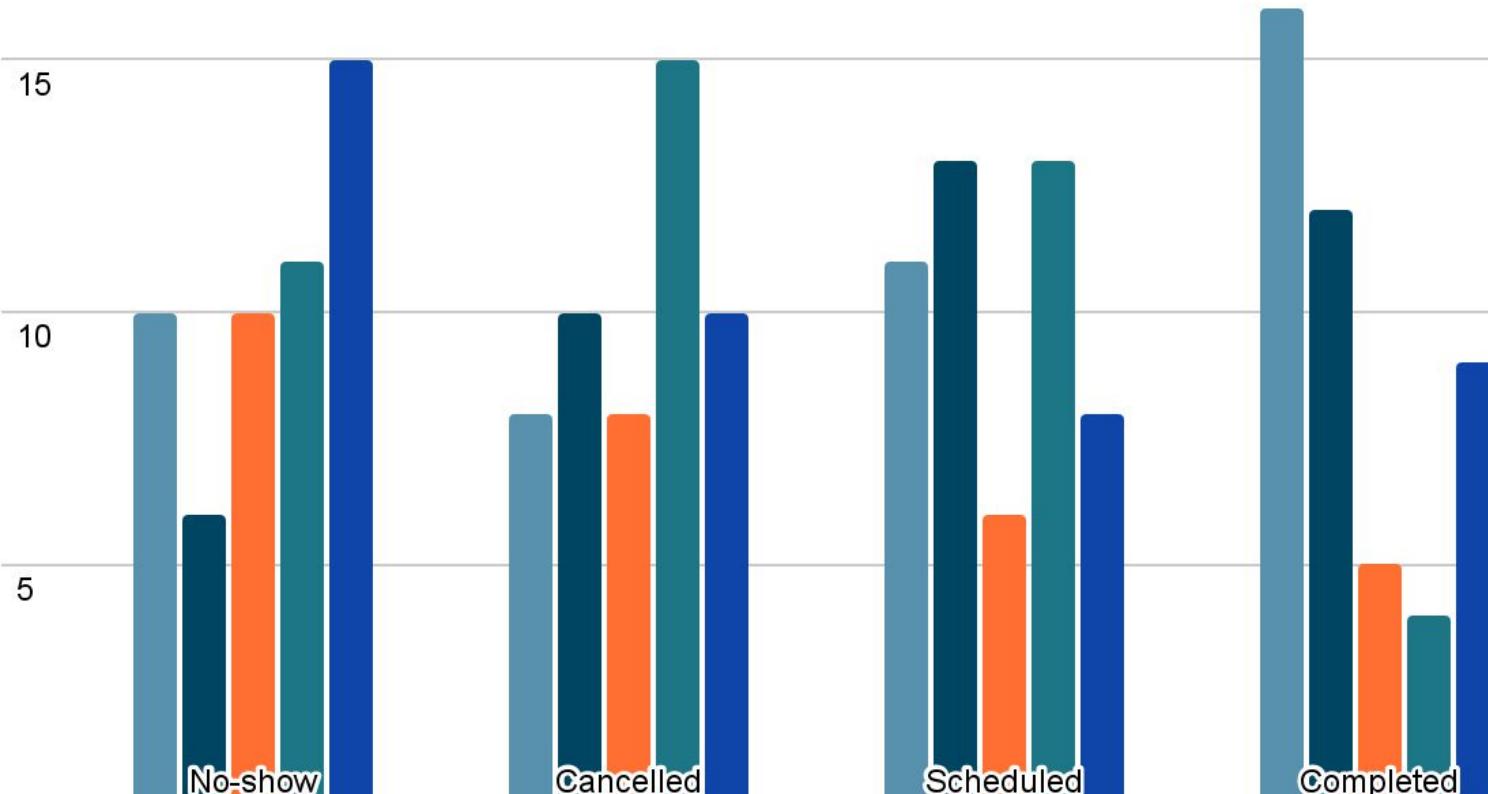
Appointment Status Percentage Distribution



Among the 200 appointments recorded, there were almost equal distribution between the 4 status. There were slightly more missed appointments, including no-shows and cancellations, suggesting potential opportunities for improvement through analysis on appointment type, departments and patient demographics of those appointments.

FINDINGS: STATUS BY APPOINTMENT TYPE

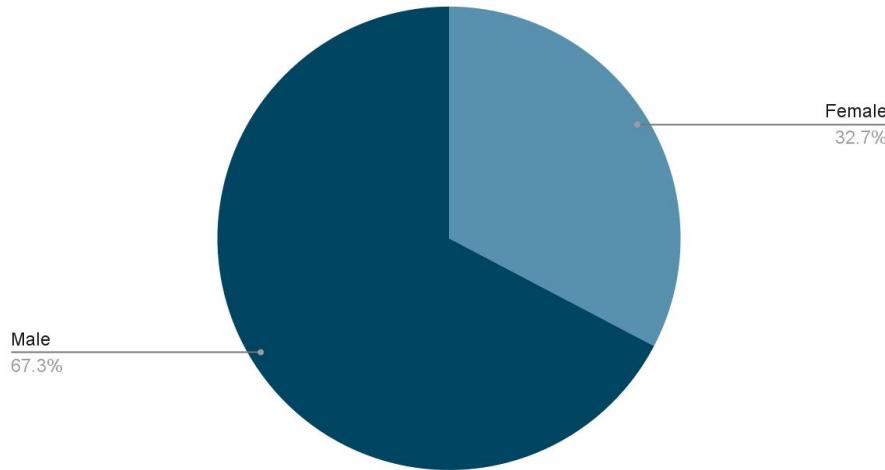
Check-up Follow-up Emergency Consultation Therapy



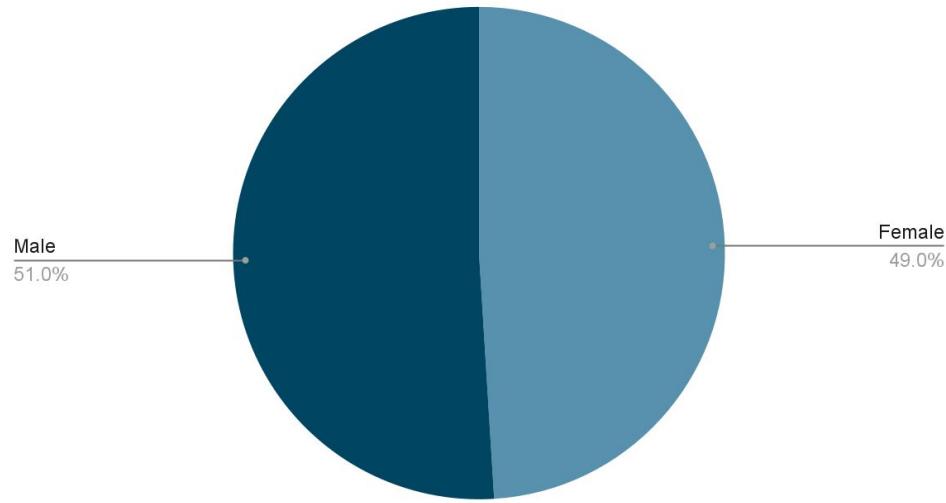
Focusing on the appointment type of each status, we can see therapy and consultation having the most no-shows and cancellations, and also being one of the least completed appointment types, implying these are the areas for improvement whether it being cancellation fees or improvement in quality of service.

FINDINGS: NO-SHOWS AND CANCELS BY GENDER

No-Show Appointments



Cancelled Appointments

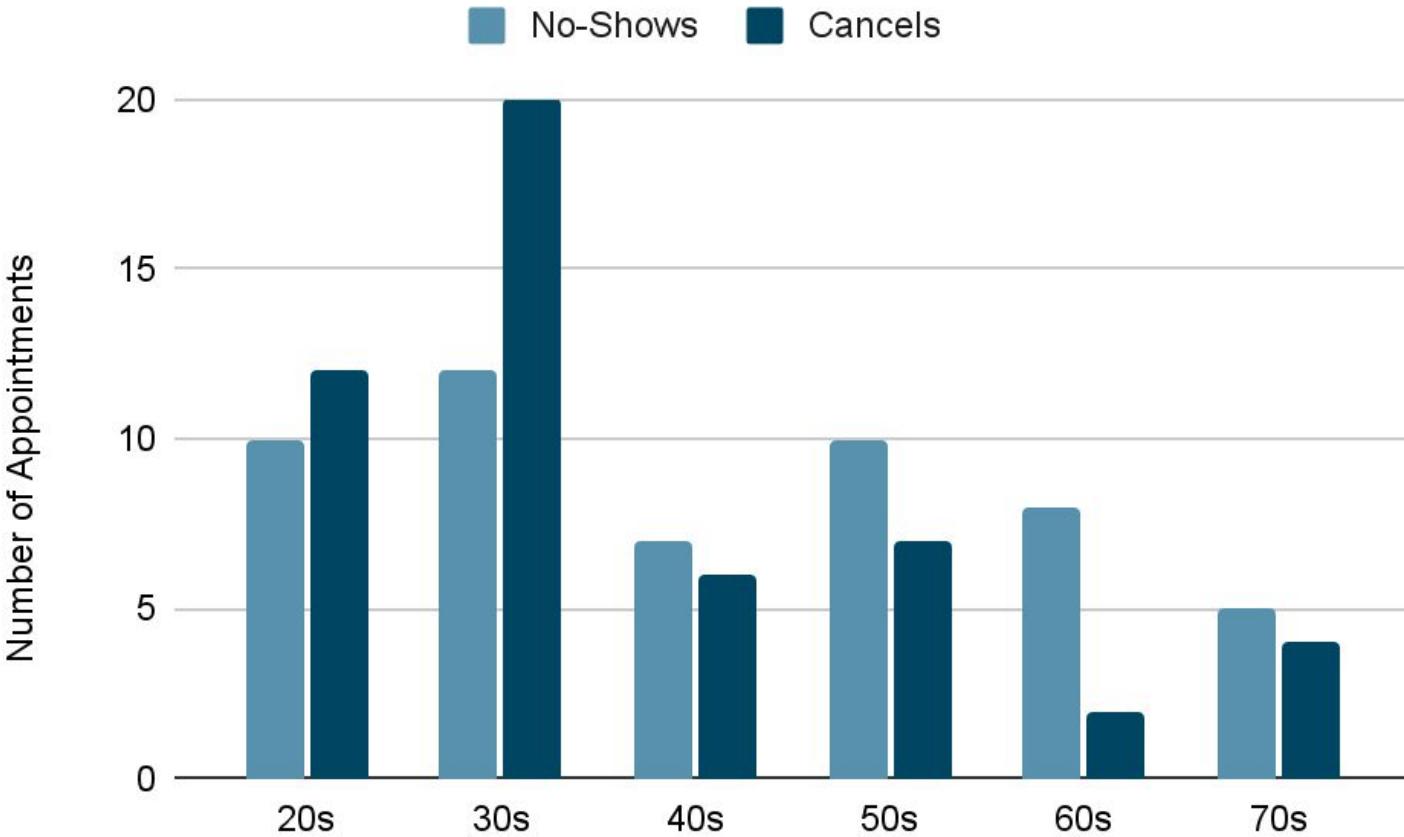


Among the 52 no-show appointments, 17 were female, 35 were male, and the gender ratio was 7:3 (male:female).

Among the 51 cancelled appointments, 25 were female, 26 were male, and the gender ratio was 5:5 (male:female).

This implies about the same amount of males and females cancel their appointments, but the majority of appointments missed without notice are with male patients.

FINDINGS: NO-SHOWS AND CANCELS BY AGE GROUP



30s and 20s had the highest numbers of cancelled and no-show appointments, and both had more cancellations than no-shows, whereas older age groups showed more no-shows than cancelled. This could imply difficulties for older generations in using technology and systems to cancel their appointments in advance.

SUMMARY

This project has focused on equity and efficiency in patient care. The findings were:

1. Males and patients in their 30s represented a larger proportion in shortest wait times, whereas females and younger adults in their 20s and older adults in their 70s seemed to appear more frequently in the shortest wait times.
2. More than half of the 200 appointments were either no-shows or cancellations. Within the missed appointment status, therapy and consultation were the largest portions, suggesting opportunity for change in those departments.
3. There were more no-shows than cancellations in older generations, whereas opposite was true for younger generations in their 20s and 30s.
4. Most cancellations were made by patients in their 30s. (40% of all cancelled appointments.)
5. Majority of no-shows were by male patients.

Improvement suggestions:

Monitor equity in wait times / Introduce cancellation fee system, and no-show penalty system / Improve quality of service / Introduce rewards system / Introduce additional technology support for older generations

| 1 | patient_id | registration_date | treatment_date | days_taken_until | gender | date_of_birth | age | treatment_type |
|----|------------|-------------------|----------------|------------------|--------|---------------|------------------|----------------|
| 2 | P045 | 2021-01-23 | 2023-10-26 | 0-0 1006 0:0:0 | F | 1966-04-25 | 0-0 59 19:12:0 | Chemotherapy |
| 3 | P039 | 2021-03-09 | 2023-12-17 | 0-0 1013 0:0:0 | F | 1950-12-12 | 0-0 75 4:16:26.3 | Chemotherapy |
| 4 | P017 | 2022-09-26 | 2023-01-17 | 0-0 113 0:0:0 | M | 1991-05-01 | 0-0 34 18:24:39 | X-Ray |
| 5 | P019 | 2023-06-24 | 2023-10-25 | 0-0 123 0:0:0 | M | 1975-05-24 | 0-0 50 17:9:41.9 | X-Ray |
| 6 | P035 | 2023-07-09 | 2023-11-13 | 0-0 127 0:0:0 | F | 1993-04-13 | 0-0 32 19:31:43 | Physiotherapy |
| 7 | P035 | 2023-07-09 | 2023-11-15 | 0-0 129 0:0:0 | F | 1993-04-13 | 0-0 32 19:31:43 | Chemotherapy |
| 8 | P019 | 2023-06-24 | 2023-11-01 | 0-0 130 0:0:0 | M | 1975-05-24 | 0-0 50 17:9:41.9 | MRI |
| 9 | P049 | 2023-06-14 | 2023-10-25 | 0-0 133 0:0:0 | M | 1972-11-26 | 0-0 53 4:55:53.4 | X-Ray |
| 10 | P048 | 2023-06-19 | 2023-11-06 | 0-0 140 0:0:0 | M | 1983-03-24 | 0-0 42 21:2:27.9 | ECG |
| 11 | P012 | 2023-04-27 | 2023-09-21 | 0-0 147 0:0:0 | F | 1991-12-08 | 0-0 34 3:52:46.0 | MRI |
| 12 | P017 | 2022-09-26 | 2023-02-23 | 0-0 150 0:0:0 | M | 1991-01-01 | 0-0 34 18:24:39 | MRI |
| 13 | P018 | 2022-09-23 | 2023-03-09 | 0-0 167 0:0:0 | M | 1979-09-24 | 0-0 46 9:0:29:58 | X-Ray |
| 14 | P036 | 2022-10-04 | 2023-03-21 | 0-0 168 0:0:0 | M | 1997-12-26 | 0-0 28 2:33:51.7 | Chemotherapy |
| 15 | P019 | 2023-06-24 | 2023-12-20 | 0-0 179 0:0:0 | M | 1975-05-24 | 0-0 50 17:9:41.9 | ECG |
| 16 | P029 | 2023-04-19 | 2023-05-07 | 0-0 180 0:0:0 | M | 2005-05-15 | 0-0 20 17:13:38 | Chemotherapy |
| 17 | P009 | 2022-09-18 | 2023-03-21 | 0-0 184 0:0:0 | M | 1971-12-11 | 0-0 54 4:0:39:45 | ECG |
| 18 | P012 | 2023-04-27 | 2023-10-29 | 0-0 185 0:0:0 | F | 1991-12-08 | 0-0 34 3:52:46.0 | Chemotherapy |
| 19 | P012 | 2023-04-27 | 2023-10-31 | 0-0 187 0:0:0 | F | 1991-12-08 | 0-0 34 3:52:46.0 | Chemotherapy |
| 20 | P050 | 2023-04-28 | 2023-11-07 | 0-0 193 0:0:0 | M | 1993-12-27 | 0-0 32 2:33:51.7 | ECG |
| 21 | P049 | 2023-06-14 | 2023-12-26 | 0-0 195 0:0:0 | M | 1972-11-26 | 0-0 53 4:55:53.4 | X-Ray |
| 22 | P036 | 2022-10-04 | 2023-04-18 | 0-0 196 0:0:0 | M | 1997-12-26 | 0-0 28 2:33:51.7 | MRI |
| 23 | P036 | 2022-10-04 | 2023-04-18 | 0-0 196 0:0:0 | M | 1997-12-26 | 0-0 28 2:33:51.7 | ECG |
| 24 | P035 | 2023-07-09 | 2023-07-29 | 0-0 20 0:0:0 | F | 1993-04-13 | 0-0 32 19:31:43 | Chemotherapy |
| 25 | P044 | 2023-01-26 | 2023-08-16 | 0-0 202 0:0:0 | F | 1976-03-11 | 0-0 49 21:57:41 | MRI |
| 26 | P011 | 2022-09-27 | 2023-04-18 | 0-0 203 0:0:0 | F | 1966-12-04 | 0-0 59 4:32:13.1 | Chemotherapy |
| 27 | P001 | 2022-06-23 | 2023-01-16 | 0-0 207 0:0:0 | F | 1955-06-04 | 0-0 70 16:46:1.6 | Chemotherapy |
| 28 | P029 | 2023-04-19 | 2023-11-16 | 0-0 211 0:0:0 | M | 2005-05-15 | 0-0 20 17:13:38 | Chemotherapy |
| 29 | P009 | 2022-09-18 | 2023-04-17 | 0-0 211 0:0:0 | M | 1971-12-11 | 0-0 54 4:0:39:45 | Chemotherapy |
| 30 | P010 | 2022-08-24 | 2023-03-27 | 0-0 215 0:0:0 | M | 2001-10-13 | 0-0 24 7:21:51.7 | Chemotherapy |
| 31 | P001 | 2022-06-23 | 2023-01-26 | 0-0 217 0:0:0 | F | 1955-06-04 | 0-0 70 16:46:1.6 | ECG |
| 32 | P017 | 2022-09-26 | 2023-05-01 | 0-0 217 0:0:0 | M | 1991-05-01 | 0-0 34 18:24:39 | Chemotherapy |
| 33 | P036 | 2022-10-04 | 2023-05-12 | 0-0 220 0:0:0 | M | 1997-12-26 | 0-0 28 2:33:51.7 | Physiotherapy |
| 34 | P043 | 2022-07-18 | 2023-03-03 | 0-0 228 0:0:0 | M | 1980-03-25 | 0-0 45 20:58:31 | X-Ray |
| 35 | P029 | 2023-04-19 | 2023-12-14 | 0-0 239 0:0:0 | M | 2005-05-15 | 0-0 20 17:13:38 | ECG |
| 36 | P012 | 2023-04-27 | 2023-12-26 | 0-0 243 0:0:0 | F | 1991-12-08 | 0-0 34 3:52:46.0 | X-Ray |
| 37 | P010 | 2022-08-24 | 2023-04-26 | 0-0 245 0:0:0 | M | 2001-10-13 | 0-0 24 7:21:51.7 | MRI |
| 38 | P041 | 2022-07-16 | 2023-04-08 | 0-0 266 0:0:0 | M | 1951-06-19 | 0-0 74 15:50:47 | X-Ray |
| 39 | P041 | 2022-07-16 | 2023-04-15 | 0-0 273 0:0:0 | M | 1951-06-19 | 0-0 74 15:50:47 | MRI |
| 40 | P012 | 2023-04-27 | 2023-05-25 | 0-0 28 0:0:0 | F | 1991-12-08 | 0-0 34 3:52:46.0 | ECG |
| 41 | P011 | 2022-09-27 | 2023-07-04 | 0-0 280 0:0:0 | F | 1966-12-04 | 0-0 59 4:32:13.1 | MRI |
| 42 | P031 | 2022-06-28 | 2023-04-04 | 0-0 280 0:0:0 | M | 1987-01-14 | 0-0 39 1:30:44.3 | MRI |
| 43 | P001 | 2022-06-23 | 2023-04-01 | 0-0 282 0:0:0 | F | 1955-06-04 | 0-0 70 16:46:1.6 | Physiotherapy |
| 44 | P001 | 2022-06-23 | 2023-04-09 | 0-0 290 0:0:0 | F | 1955-06-04 | 0-0 70 16:46:1.6 | Chemotherapy |
| 45 | P010 | 2022-08-24 | 2023-06-11 | 0-0 291 0:0:0 | M | 2001-10-13 | 0-0 24 7:21:51.7 | X-Ray |
| 46 | P042 | 2022-03-15 | 2023-01-01 | 0-0 292 0:0:0 | F | 1954-08-22 | 0-0 71 11:34:21 | Chemotherapy |
| 47 | P043 | 2022-07-18 | 2023-05-08 | 0-0 294 0:0:0 | M | 1980-03-25 | 0-0 45 20:58:31 | Chemotherapy |
| 48 | P044 | 2023-01-26 | 2023-11-27 | 0-0 305 0:0:0 | F | 1976-03-11 | 0-0 49 21:57:41 | Chemotherapy |
| 49 | P018 | 2022-09-23 | 2023-08-08 | 0-0 319 0:0:0 | M | 1979-09-24 | 0-0 46 9:0:29:58 | Chemotherapy |
| 50 | P019 | 2023-06-24 | 2023-07-26 | 0-0 32 0:0:0 | M | 1975-05-24 | 0-0 50 17:9:41.9 | Physiotherapy |
| 51 | P009 | 2022-09-18 | 2023-08-16 | 0-0 332 0:0:0 | M | 1971-12-11 | 0-0 54 4:0:39:45 | Chemotherapy |
| 52 | P010 | 2022-08-24 | 2023-07-23 | 0-0 333 0:0:0 | M | 2001-10-13 | 0-0 24 7:21:51.7 | ECG |
| 53 | P041 | 2022-07-16 | 2023-06-15 | 0-0 334 0:0:0 | M | 1951-06-19 | 0-0 74 15:50:47 | ECG |
| 54 | P042 | 2022-03-15 | 2023-02-26 | 0-0 348 0:0:0 | F | 1954-08-22 | 0-0 71 11:34:21 | Physiotherapy |
| 55 | P049 | 2023-06-14 | 2023-07-19 | 0-0 35 0:0:0 | M | 1972-11-26 | 0-0 53 4:55:53.4 | Chemotherapy |

Input and output:

Average wait time, age findings: combined appointments and patients files using JOIN function, joining patient id.

My code:

```

SELECT patient_id, registration_date, treatment_date, (treatment_date - registration_date) as days taken until treatment completed, gender, date of birth, cost, (current_date - date_of_birth)/365 as age, treatment_type
FROM
utility-span-484509-m6.hospital_management.patients_and_appointments_joined
as pa
JOIN `utility-span-484509-m6.hospital_management.treatments` AS t
ON pa.appointment_id = t.appointment_id
WHERE registration_date <= treatment_date
ORDER BY days_taken_until_treatment_completed

```



[Link to full data set:](https://docs.google.com/spreadsheets/d/1Ah1ATb1t9pCH8cYpCNV8Yh0duxELOGCTweLdE9VtAw0/edit?usp=sharing)

<https://docs.google.com/spreadsheets/d/1Ah1ATb1t9pCH8cYpCNV8Yh0duxELOGCTweLdE9VtAw0/edit?usp=sharing>

SQL input:

```
--what is the sum of status by reason for visit?  
SELECT COUNT(*) AS sum, status, reason_for_visit  
FROM `utility-span-484509-m6.hospital_management.appointments`  
GROUP BY status, reason_for_visit  
ORDER BY status, sum DESC;
```



```
-- what is the percentage for each status of appointments (cancelled,  
no-show, completed, scheduled appointments)?  
SELECT status, count(*) as total_no_of_appointments,  
round(count(*)*100/200,0) as percentage  
FROM `utility-span-484509-m6.hospital_management.patients` as p  
JOIN `utility-span-484509-m6.hospital_management.appointments`as a  
ON p.patient_id = a.patient_id  
GROUP BY status  
-- cancelled, scheduled, no-show = 26% each, completed = 23%
```



| Row | status | total_no_of_appo... | percentage |
|-----|-----------|---------------------|------------|
| 1 | Cancelled | 51 | 26.0 |
| 2 | Scheduled | 51 | 26.0 |
| 3 | Completed | 46 | 23.0 |
| 4 | No-show | 52 | 26.0 |

Data output:

| Row | sum | status | reason_for_visit |
|-----|-----|-----------|------------------|
| 1 | 15 | Cancelled | Consultation |
| 2 | 10 | Cancelled | Follow-up |
| 3 | 10 | Cancelled | Therapy |
| 4 | 8 | Cancelled | Checkup |
| 5 | 8 | Cancelled | Emergency |
| 6 | 16 | Completed | Checkup |
| 7 | 12 | Completed | Follow-up |
| 8 | 9 | Completed | Therapy |
| 9 | 5 | Completed | Emergency |
| 10 | 4 | Completed | Consultation |
| 11 | 15 | No-show | Therapy |
| 12 | 11 | No-show | Consultation |
| 13 | 10 | No-show | Emergency |
| 14 | 10 | No-show | Checkup |
| 15 | 6 | No-show | Follow-up |
| 16 | 13 | Scheduled | Follow-up |
| 17 | 13 | Scheduled | Consultation |
| 18 | 11 | Scheduled | Checkup |
| 19 | 8 | Scheduled | Therapy |
| 20 | 6 | Scheduled | Emergency |

<Cancelled Patient demographic> Input:
Finding out the patient demographic for status 'No-show'
and 'Cancelled' from patient and appointments joint table

My code:

```
-- What is the patient demographic of cancelled appointments?  
SELECT status, p.patient_id, date_of_birth, gender, registration_date  
FROM `utility-span-484509-m6.hospital_management.patients` AS p  
LEFT JOIN `utility-span-484509-m6.hospital_management.appointments` AS a  
ON p.patient_id = a.patient_id  
WHERE status = 'Cancelled'  
ORDER BY date_of_birth  
  
-- Total number of cancelled appointments = 51, F =25, M =26, (F=49%, M=51%)  
-- 1995-2005=12 (20s=24%), 1985-1995=20 (39%), 1975-1985=6 (12%), 1965-1975=7  
(14%), 1955-1965=2 (4%), 1945-1955=4 (8%)
```

Snippet of the data output:

| | | | | |
|-----------|------|------------|---|------------|
| Cancelled | P039 | 1950/12/12 | F | 2021/03/09 |
| Cancelled | P041 | 1951/06/19 | M | 2022/07/16 |
| Cancelled | P022 | 1955/05/10 | M | 2021/05/11 |
| Cancelled | P001 | 1955/06/04 | F | 2022/06/23 |
| Cancelled | P030 | 1964/12/23 | M | 2021/08/07 |
| Cancelled | P045 | 1966/04/25 | F | 2021/01/23 |
| Cancelled | P025 | 1966/08/14 | M | 2021/09/09 |
| Cancelled | P025 | 1966/08/14 | M | 2021/09/09 |
| Cancelled | P011 | 1966/12/04 | F | 2022/09/27 |
| Cancelled | P014 | 1968/02/27 | M | 2023/12/12 |
| Cancelled | P033 | 1970/02/06 | F | 2023/09/06 |
| Cancelled | P009 | 1971/12/11 | M | 2022/09/18 |
| Cancelled | P019 | 1975/05/24 | M | 2023/06/24 |
| Cancelled | P019 | 1975/05/24 | M | 2023/06/24 |
| Cancelled | P044 | 1976/03/11 | F | 2023/01/26 |
| Cancelled | P044 | 1976/03/11 | F | 2023/01/26 |
| Cancelled | P043 | 1980/03/25 | M | 2022/07/18 |
| Cancelled | P048 | 1983/03/24 | M | 2023/06/19 |
| Cancelled | P002 | 1984/10/12 | F | 2022/01/15 |
| Cancelled | P046 | 1986/09/01 | F | 2021/07/31 |
| Cancelled | P046 | 1986/09/01 | F | 2021/07/31 |
| Cancelled | P031 | 1987/01/14 | M | 2022/06/28 |
| Cancelled | P007 | 1989/06/08 | F | 2021/12/25 |
| Cancelled | P007 | 1989/06/08 | F | 2021/12/25 |
| Cancelled | P007 | 1989/06/08 | F | 2021/12/25 |
| Cancelled | P013 | 1990/03/28 | F | 2021/12/23 |
| Cancelled | P017 | 1991/05/01 | M | 2022/09/26 |

Link to full data set:

<https://docs.google.com/spreadsheets/d/1LrkhfU7BaY6B0zgqZMIMqqAKEVZoLPQkPfp48JvFlfY/edit?usp=sharing>



<No-Show Patient Demographic> Input: Snippet of the data output:

My Code:

```
-- What is the patient demographic of no-show appointments?  
SELECT status, p.patient_id, date_of_birth, gender, registration_date  
FROM `utility-span-484509-m6.hospital_management.patients` as p  
LEFT JOIN `utility-span-484509-m6.hospital_management.appointments` as a  
ON p.patient_id = a.patient_id  
WHERE status = 'No-show'  
ORDER BY date_of_birth  
  
-- Total number of no-show appointments =52, F=17, M=35, (F=33%, M=67%)  
-- No-show total = 52, date_of_birth before 1995 (age 30+)=42, after  
1995 (age 20 - 30)=10, (30+ =81%, 20-30=19%)  
-- 1985-1995 = 12, 1975-1985=7, 1965-1975=10, 1955-1965=8, 1945-1955=5  
(20s=19%, 30s=23%, 40s=13%, 50s=19%, 60s=15%, 70s=9%)
```



Link to full data set:

https://docs.google.com/spreadsheets/d/1QrD4WDmjFjoLd9M45JNVvetBHGc-YIQ_CXHonUMFkpweedit?usp=sharing

| status | patient_id | date_of_birth | gender | registration_date |
|---------|------------|---------------|--------|-------------------|
| No-show | P034 | 1950/01/26 | F | 2023/06/18 |
| No-show | P039 | 1950/12/12 | F | 2021/03/09 |
| No-show | P039 | 1950/12/12 | F | 2021/03/09 |
| No-show | P039 | 1950/12/12 | F | 2021/03/09 |
| No-show | P042 | 1954/08/22 | F | 2022/03/15 |
| No-show | P022 | 1955/05/10 | M | 2021/05/11 |
| No-show | P022 | 1955/05/10 | M | 2021/05/11 |
| No-show | P001 | 1955/06/04 | F | 2022/06/23 |
| No-show | P005 | 1960/06/23 | M | 2021/09/29 |
| No-show | P005 | 1960/06/23 | M | 2021/09/29 |
| No-show | P005 | 1960/06/23 | M | 2021/09/29 |
| No-show | P005 | 1960/06/23 | M | 2021/09/29 |
| No-show | P030 | 1964/12/23 | M | 2021/08/07 |
| No-show | P045 | 1966/04/25 | F | 2021/01/23 |
| No-show | P025 | 1966/08/14 | M | 2021/09/09 |
| No-show | P033 | 1970/02/06 | F | 2023/09/06 |
| No-show | P033 | 1970/02/06 | F | 2023/09/06 |