

Mini Personal Project

People Analytics

Azriel Akbar Al Fajri

A Look into Azriel's Profile



A resilient and content-pursuer person, currently pursuing an undergraduate degree in Economics at the University of Brawijaya. He has various experiences in data analytics initiatives, such as a Data Analyst Intern at KNEKS, Data Analyst Generasi Gigih Apprenticeship at GoTo Impact Foundation, Incoming Capstonian with Jobhun (Generasi Gigih Industry Partner's Capstone Project), etc.

He agrees that both data and new things are akin to oil—valuable resources that can infuse life with excitement. But, without the ability to refine them, their value remains untapped.

His ultimate goal is to make the world a much better place to live by improving the accuracy of human and business decision-making that's being reflected in Belajar Manusia

Hard-skill:









People Analytics

Definition

Purpose of Analysis



People Analytics is a process of collecting, analyzing, and interpreting human data in the field of human resources that can unlock the true potential of your workforce.





This project is designed to extract valuable insights about performance and attrition of employees and provide recommendations to address any issues that may arise.

About Dataset



The dataset can be obtained on Kaggle through this <u>Employee Dataset link</u>. The dataset is a fabricated dataset designed for the purpose of experimenting with different data analysis and machine learning approaches in the field of human resources and employee management. While this dataset mimics the format and attributes of genuine employee data, it's important to note that all the information it contains is entirely fictional and has been generated for demonstration purposes only.

Data Preprocessing



Preview of Data

Head of the data

| Er | pID Fir | rstName | LastName | StartDate | ExitDate | Title | Supervisor | ADEmail | BusinessUnit | EmployeeStatus | Division | DOB | State | JobFunctionDescription | GenderCode | LocationCode | RaceDesc | MaritalDesc | Performance Score | Current Employee Rating |
|---------|-----------|---------|----------|-----------|----------|-------------------------|-----------------|-------------------------------|--------------|----------------|----------------------|------------|-------|------------------------|------------|--------------|----------|-------------|-------------------|-------------------------|
| 0 3 | 427 | Uriah | Bridges | 20-Sep-19 | NaN | Production Technician I | Peter Oneill | uriah.bridges@bilearner.com | CCDR | Active | Finance & Accounting | 07-10-1969 | MA | Accounting | Female | 34904 | White | Widowed | Fully Meets | 4 |
| 1 3 | 428 | Paula | Small | 11-Feb-23 | NaN | Production Technician I | Renee Mccormick | paula.small@bilearner.com | EW | Active | Aerial | 30-08-1965 | MA | Labor | Male | 6593 | Hispanic | Widowed | Fully Meets | 3 |
| 2 3 | 429 | Edward | Buck | 10-Dec-18 | NaN | Area Sales Manager | Crystal Walker | edward.buck@bilearner.com | PL | Active | General - Sga | 06-10-1991 | MA | Assistant | Male | 2330 | Hispanic | Widowed | Fully Meets | 4 |
| 3 3 | 430 | Michael | Riordan | 21-Jun-21 | NaN | Area Sales Manager | Rebekah Wright | michael.riordan@bilearner.com | CCDR | Active | Finance & Accounting | 04-04-1998 | ND | Clerk | Male | 58782 | Other | Single | Fully Meets | 2 |
| 4 3 | 431 . | Jasmine | Onque | 29-Jun-19 | NaN | Area Sales Manager | Jason Kim | jasmine.onque@bilearner.com | TNS | Active | General - Con | 29-08-1969 | FL | Laborer | Female | 33174 | Other | Married | Fully Meets | 3 |
| 5 rouse | v 26 colu | imne | | | | | | | | | | | | | | | | | | |

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3000 entries, 0 to 2999

Data columns (total 26 columns):

| Data | columns (total 26 columns): | | |
|-------|-----------------------------|----------------|--------|
| # | Column | Non-Null Count | Dtype |
| | | | |
| 0 | EmpID | 3000 non-null | int64 |
| 1 | FirstName | 3000 non-null | object |
| 2 | LastName | 3000 non-null | object |
| 3 | StartDate | 3000 non-null | object |
| 4 | ExitDate | 1533 non-null | object |
| 5 | Title | 3000 non-null | object |
| 6 | Supervisor | 3000 non-null | object |
| 7 | ADEmail | 3000 non-null | object |
| 8 | BusinessUnit | 3000 non-null | object |
| 9 | EmployeeStatus | 3000 non-null | object |
| 10 | EmployeeType | 3000 non-null | object |
| 11 | PayZone | 3000 non-null | object |
| 12 | EmployeeClassificationType | 3000 non-null | object |
| 13 | TerminationType | 3000 non-null | object |
| 14 | TerminationDescription | 1533 non-null | object |
| 15 | DepartmentType | 3000 non-null | object |
| 16 | Division | 3000 non-null | object |
| 17 | DOB | 3000 non-null | object |
| 18 | State | 3000 non-null | object |
| 19 | JobFunctionDescription | 3000 non-null | object |
| 20 | GenderCode | 3000 non-null | object |
| 21 | LocationCode | 3000 non-null | int64 |
| 22 | RaceDesc | 3000 non-null | object |
| 23 | MaritalDesc | 3000 non-null | object |
| 24 | Performance Score | 3000 non-null | object |
| 25 | Current Employee Rating | 3000 non-null | int64 |
| dtype | es: int64(3), object(23) | | |
| memor | ry usage: 609.5+ KB | | |
| | | | |

Data information:

Column: 26 columns Row: 3000 rows

There are 2 columns containing null values, but still make sense

| EmpID | 3000 |
|----------------------------|------|
| FirstName | 1597 |
| LastName | 1137 |
| StartDate | 1496 |
| ExitDate | 820 |
| Title | 32 |
| Supervisor | 2952 |
| ADEmail | 2998 |
| BusinessUnit | 10 |
| EmployeeStatus | 5 |
| EmployeeType | 3 |
| PayZone | 3 |
| EmployeeClassificationType | 3 |
| TerminationType | 5 |
| TerminationDescription | 1533 |
| DepartmentType | 6 |
| Division | 25 |
| DOB | 2800 |
| State | 28 |
| JobFunctionDescription | 83 |
| GenderCode | 2 |
| LocationCode | 2821 |
| RaceDesc | 5 |
| MaritalDesc | 4 |
| Performance Score | 4 |
| Current Employee Rating | 5 |
| dtype: int64 | |
| | |

Unique values in each column



Data Manipulation

```
Column: Title
Unique Values: ['Accountant I' 'Administrative Assistant' 'Area Sales Manager'
'BI Developer' 'BI Director' 'CIO' Data Analyst' 'Data Analyst'
'Data Architect' 'Database Administrator' 'Director of Operations'
'Director of Sales' 'Enterprise Architect' 'IT Director'
'IT Manager - DB' 'IT Manager - Infra' 'IT Manager - Support'
'IT Support' 'Network Engineer' 'President & CEO'
'Principal Data Architect' 'Production Manager' 'Production Technician I'
'Production Technician II' 'Sales Manager' 'Senior BI Developer'
'Shared Services Manager' 'Software Engineer'
'Software Engineering Manager' 'Sr. Accountant' 'Sr. DBA'
'Sr. Network Engineer']

Column: DepartmentType
Unique Values: ['Admin Offices' 'Executive Office' 'IT/IS' 'Production 'Software Engineering']
```

1. Handling White Space Issues

Handling white space issues to avoid double counting on **Title** column and inappropriate records on **DepartmentType** column

2. Change the objected-date type to datetime



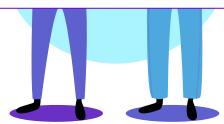
3. Inspect duplicated records

It's become a problem if employees have the same email and still have an active status. The company need to do a real-time validation when new employees register their emails. Employees, need to ask to related department if not-only-once unknown email is being delivered to them

| | EmployeeStatus | DOB | StartDate | ExitDate | ADEmail |
|------|----------------------|------------|------------|------------|------------------------------|
| 1974 | Terminated for Cause | 1945-09-23 | 2022-11-09 | 2023-01-10 | darien.young@bilearner.com |
| 2204 | Active | 1998-09-04 | 2021-03-03 | NaT | darien.young@bilearner.com |
| 865 | Active 19 | 43-06-27 2 | 018-10-27 | NaT | larissa.warner@bilearner.com |
| 1742 | Active 19 | 95-12-26 2 | 020-07-04 | 2022-05-11 | larissa.warner@bilearner.com |

4. Add 2 new columns

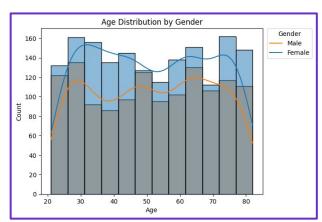
To support analysis, column `Age` and `Tenure` was added to the dataframe

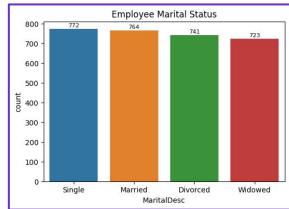


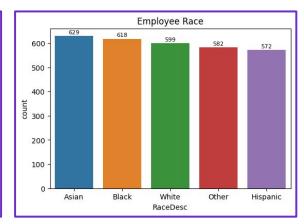
Exploratory Data Analysis



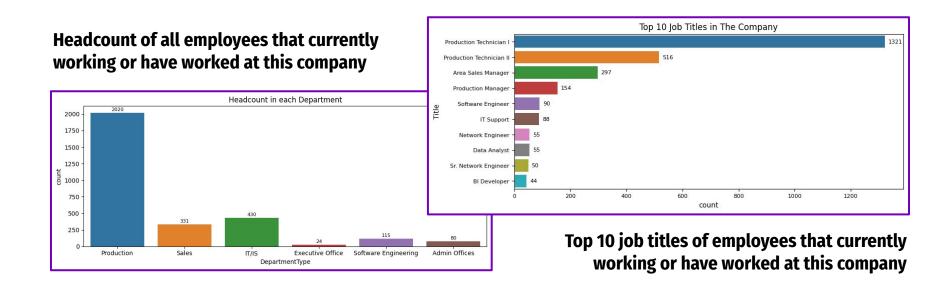
Employees Basic Demographics Information



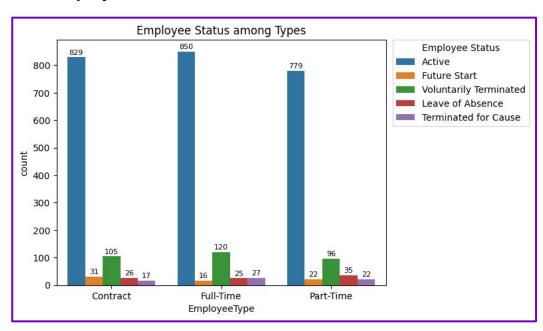




If we look at the first graph, we can see the number of Females is higher than Males. Then, the distribution is slightly similar among ages, marital statuses, and races.

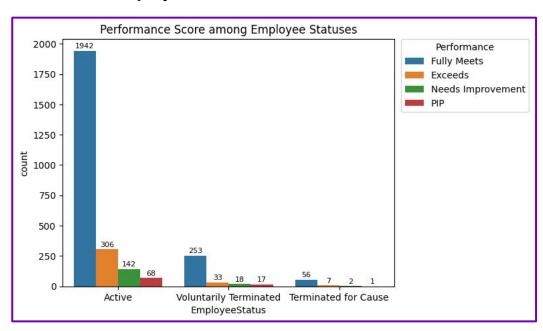


What is the headcount in each employment classification type and employee status?



On all employee classifications, there are 2458 active employees, 387 employees who have been terminated (both voluntarily or involuntarily), and 69 will start soon.

How is the performance between active employees and terminated employees?



On all statuses, most employees were scored **Fully Meets**, but this is not clear enough. So, **Current Employee Rating** will be used to see the average rating or evaluation of all employee's performance score

What is the average employee rating between active and terminated employees?

| EmployeeStatus | Active | Terminated for Cause | Voluntarily Terminated | All |
|----------------------------|----------|----------------------|------------------------|----------|
| EmployeeClassificationType | | | | |
| Full-Time | 2.967857 | 2.791667 | 3.019608 | 2.968944 |
| Part-Time | 3.016688 | 3.600000 | 3.095238 | 3.035595 |
| Temporary | 2.897497 | 3.074074 | 3.087719 | 2.924490 |
| All | 2.959317 | 3.090909 | 3.068536 | 2.974692 |

Overall, the average employee performance rating is **2.9 out of 5.0**, which is —we can say, met the company expectations. However, active employees have slightly lower scores compared to other groups.

How long have active or terminated employees stayed (tenure)?

| EmployeeStatus | Active | Terminated for Cause | Voluntarily Terminated | All |
|----------------------------|------------|-------------------------|---------------------------|------------|
| EmployeeClassificationType | | | | |
| Full-Time | 509.193353 | 534.083333 | 545.098039 | 518.514223 |
| Part-Time | 478.394040 | 293.800000 | 478.647619 | 471.895735 |
| Temporary | 439.377095 | 549.000000 | 550.017544 | 470.585170 |
| All | 474.586276 | 485.575758 | 525.109034 | 486.881713 |

Both involuntarily/voluntarily terminated employee have an average tenure about 505 days or about a year and a quarter before they leave. Looking back the employees' ratings, they tend to have higher ratings compared to active employees. Many factors may contribute to the progress of employees' performance before they leave. Such as, the company's training and development programs, company's culture, bonuses, and more. However, it's crucial to the company to assess its employee retention and turnover, are they good or bad?

Retention and Attrition Analysis

Make a new dataset and build some metrics

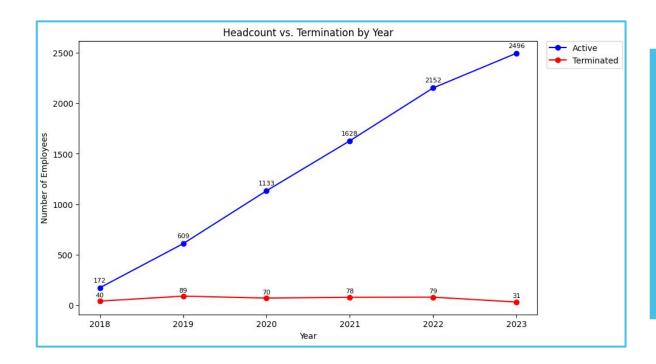
| | Year | New Employee | Terminated Employee | Employee Start | Employee End | Attrition Rate | Retention Rate |
|---|------|--------------|---------------------|----------------|--------------|----------------|----------------|
| 0 | 2018 | 212 | 40 | 212 | 172 | 20.83 | 81.13 |
| 1 | 2019 | 486 | 89 | 698 | 609 | 13.62 | 87.25 |
| 2 | 2020 | 505 | 70 | 1203 | 1133 | 5.99 | 94.18 |
| 3 | 2021 | 503 | 78 | 1706 | 1628 | 4.68 | 95.43 |
| 4 | 2022 | 525 | 79 | 2231 | 2152 | 3.60 | 96.46 |
| 5 | 2023 | 296 | 31 | 2527 | 2496 | 1.23 | 98.77 |

Retention and Attrition Rate Metrics

```
emp_atre['Attrition Rate'] = round((emp_atre['Terminated Employee']) / ((emp_atre['Employee Start'] + emp_atre['Employee End'])/2) * 100,2)
emp_atre['Retention Rate'] = round((emp_atre['Employee End']) / emp_atre['Employee Start'] * 100,2)
```

Note: In 2018, the initial count for Employee Start was setted as 212, reflecting the company's need to have a foundational workforce in place to initiate and support its operations

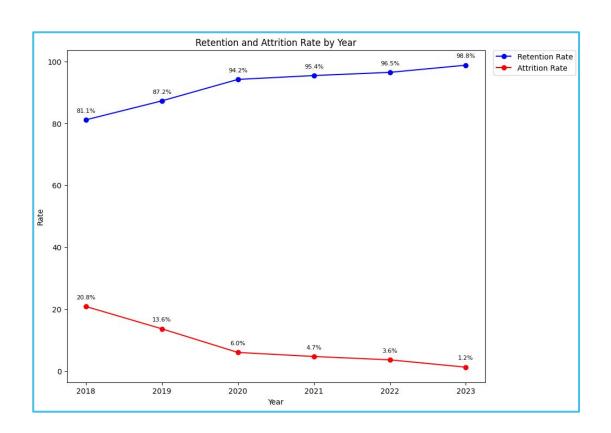
Retention and Attrition Analysis



With the significant growth of active employees each year and also a relative stagnant of terminated employees. It may caused by many factors, such as a massive expansion of business, and the company's own strategies. For clearer insight(s) we can see through the retention and attrition rate

Retention and Attrition Analysis

Based on <u>People Keep</u>, the business should maintain an attrition rate lower than 10% and aimed retention rate above 90%. The company experienced a very high turnover rate at the beginning of business but become better as time flies



Insights

Employee's Profile

Performance

Tenure

Retention and Attrition Rate With 2458 active employees, 387 employees who have been terminated (both voluntarily or involuntarily), and 69 will start soon. The company have a lot employees who work as Technician, Sales, and Engineer.

Also, women are dominating in this company

About 79% of employees that currently working or have worked at this company, successfully met the company's expectations. Moreover, 12% exceeds the expectations. However, active employees have slightly lower rating scores compared to other groups.

Employees typically stayed for an average of a year and three months. When examining the average ratings, it becomes apparent that those who stayed longer tend to have a slightly higher performance levels.

Retention rate tells a good number. On the other hand, The company experienced a very high turnover rate at the beginning of business but become better as time flies

Recommendation

- The company has improved its retention rate over the years, which is a
 positive sign. However, recognizing the trend of employees staying for
 around a year and three months it's important to retain employees for
 longer periods and improve overall employee satisfaction, consider
 conducting employee engagement surveys, career growth opportunity, build
 positive environment, and performance feedback sessions to identify areas
 for improvement in the workplace.
- Data from <u>Glassdoor</u>, a good onboarding program can improve new hire retention by 82%. So, designing a strategic onboarding program for incoming new employees to learn about the company's culture and details about their job description may help the retention of employee.
- To smooth the operational processes, it's also important to regularly check company's data quality

Thank you.

Related info:



Access to Google Colab*

*you are welcome to giving comment to the content