Project Title: Layoffs Data Cleaning & Feature Engineering Report

TOOL: SQL SERVER MANAGEMENT STUDIO (SSMS)

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Project Overview:

This project focuses on cleaning and preparing the Layoffs dataset for predictive modeling and further analysis.

The goal is to make the dataset accurate, consistent, and ready for insights that can help identify if a company or individual is vulnerable to layoffs.

Objectives:

- Handle missing and inconsistent values.
- Standardize text, date, and numeric formats.
- Create clean, reliable features for modeling and reporting.

DATA CLEANING AND FEATURE ENGINEERING

CREATE DATABASE Layoff **USE** Layoff **SELECT** * FROM layoffs

Data Import & Schema Creation

- Loaded raw Layoffs dataset into SQL schema.
- Defined proper data types for numeric, text, and date columns.

CREATE SCHEMA

CREATE SCHEMA stg

<u>Insert raw data inot the schema</u> <u>SELECT * INTO stg.Layoff FROM layoffs</u>

FULL RAW TABLE VIEW

SELECT * FROM stg.Layoff

⊞ R	esults 🖺 Me	ssages									
	company	location	total_laid_off	date	percentage_laid_off	industry	source	stage	funds_raised	country	date_added
1	GamesKraft	Bengaluru, Non-U.S.	120	2025-09-18	NULL	Consumer	https://inc42.com/buzz/now-gameskraft-lays-off-120	Unknown	NULL	India	2025-09-25
2	ZipRecruiter	Tel Aviv, Non-U.S.	80	2025-09-16	NULL	Recruiting	https://www.calcalistech.com/ctechnews/article/pw	Post-IPO	769.00	United States	2025-09-16
3	Fiver	Tel Aviv, Non-U.S.	250	2025-09-15	30%	Other	https://www.wsj.com/business/fiverrto-cut-about-25	Post-IPO	111.00	Israel	2025-09-16
4	Hike	New Delhi, Non-U.S.	NULL	2025-09-13	100%	Consumer	https://techcrunch.com/2025/09/13/hike-once-a-un	Unknown	261.00	India	2025-09-15
5	xAl	SF Bay Area	500	2025-09-12	NULL	Al	https://www.businessinsider.com/elon-musk-xai-layof	Unknown	22700.00	United States	2025-09-15
6	Zupee	New Delhi, Non-U.S.	170	2025-09-11	30%	Consumer	https://yourstory.com/2025/09/zupee-employees-rea	Series B	121.00	India	2025-09-15
7	Atlassian	Sydney,Non-U.S.	200	2025-09-10	NULL	Other	https://www.ziptone.nl/en/nieuws/atlassian-schrapt	Post-IPO	210.00	Australia	2025-09-18
8	Microsoft	Seattle	42	2025-09-08	NULL	Other	https://www.bizjournals.com/seattle/news/2025/09/	Post-IPO	1.00	United States	2025-09-08
9	Rivian	Los Angeles	200	2025-09-05	1%	Transpo	https://www.latimes.com/business/story/2025-09-08	Post-IPO	10700.00	United States	2025-09-08
10	Scope3	New York City	NULL	2025-09-05	NULL	Energy	https://www.adweek.com/media/scope3-lays-off-sal	Series B	45.00	United States	2025-09-08
11	Head Digit	Hyderabad,Non-U	500	2025-09-04	NULL	Consumer	https://entrackr.com/news/a23-parent-lays-off-500-e	Private	74.00	India	2025-09-08
12	Salesforce	SF Bay Area	262	2025-09-04	NULL	Sales	https://www.kron4.com/news/bay-area/salesforce-l	Post-IPO	65.00	United States	2025-09-08
13	Oracle	SF Bay Area	254	2025-09-04	NULL	Other	https://www.kron4.com/news/technology-ai/oracle	Post-IPO	NULL	United States	2025-09-08
14	GupShup	SF Bay Area	100	2025-09-04	NULL	Other	https://inc42.com/buzz/exclusive-gupshup-lays-off-1	Series F	484.00	India	2025-09-08
15	Bobble Al	New Delhi, Non-U.S.	50	2025-09-04	NULL	Consumer	https://entrackr.com/exclusive/exclusive-bobble-ai-l	Unknown	59.00	India	2025-09-08
16	Oracle	Seattle	101	2025-09-03	NULL	Other	https://www.seattletimes.com/business/cloud-comp	Post-IPO	NULL	United States	2025-09-08
17	Salesforce	Seattle	93	2025-09-03	NULL	Sales	https://www.seattletimes.com/business/seattle-area	Post-IPO	65.00	United States	2025-09-08
18	Salesforce	Dublin, Non-U.S.	30	2025-09-03	NULL	Sales	https://www.thejournal.ie/salesforce-ireland-redunda	Post-IPO	65.00	United States	2025-09-08
19	The Gist	Tel Aviv, Non-U.S.	NULL	2025-09-03	100%	Other	https://www.calcalistech.com/ctechnews/article/jey	Seed	7.00	Israel	2025-09-08
20	Vimeo	New York City	NULL	2025-09-03	10%	Consumer	https://www.linkedin.com/posts/phmoyer_today-we	Post-IPO	450.00	United States	2025-09-08
21	Oracle	Kansas City	NULL	2025-09-02	NULL	Other	https://www.kmbc.com/article/oracle-layoffs-kansas	Post-IPO	NULL	United States	2025-09-08
22	Games 24x7	Mumbai,Non-U.S.	400	2025-09-01	NULL	Consumer	https://www.peoplematters.in/news/strategic-hr/afte	Unknown	75.00	India	2025-09-02
23	Mobile Pre	Bengaluru, Non-U.S.	300	2025-09-01	NULL	Consumer	https://timesofindia.indiatimes.com/technology/tech	Series E	375.00	India	2025-09-02
24	Krutrim	Bengaluru, Non-U.S.	50	2025-09-01	NULL	Al	https://www.techinasia.com/news/olas-krutrim-cuts	Unknown	304.00	India	2025-09-02
25	Salesforce	SF Bay Area	4000	2025-08-31	NULL	Sales	https://www.businessinsider.com/marc-benioff-says-s	Post-IPO	65.00	United States	2025-09-02
	_					_					

Before

The raw data contained nulls, inconsistent text, and mixed formats.

Standardlize tect

```
UPPER(TRIM(Company)) AS Company,
UPPER(TRIM( Location)) AS Location,
UPPER(TRIM(industry)) AS industry,
UPPER(TRIM(Stage)) AS Stage,
UPPER(TRIM(country)) AS Ccountry
```

FROM stg.Layoff

	Company	Location	industry	Stage	Ccountry
1	GAMESKRAFT	BENGALURU,NON-U.S.	CONSUMER	UNKNOWN	INDIA
2	ZIPRECRUITER	TEL AVIV,NON-U.S.	RECRUITING	POST-IPO	UNITED STATES
3	FIVERR	TEL AVIV,NON-U.S.	OTHER	POST-IPO	ISRAEL
4	HIKE	NEW DELHI,NON-U.S.	CONSUMER	UNKNOWN	INDIA
5	XAI	SF BAY AREA	Al	UNKNOWN	UNITED STATES
6	ZUPEE	NEW DELHI,NON-U.S.	CONSUMER	SERIES B	INDIA
7	ATLASSIAN	SYDNEY,NON-U.S.	OTHER	POST-IPO	AUSTRALIA
8	MICROSOFT	SEATTLE	OTHER	POST-IPO	UNITED STATES
9	RIVIAN	LOS ANGELES	TRANSPO	POST-IPO	UNITED STATES
10	SCOPE3	NEW YORK CITY	ENERGY	SERIES B	UNITED STATES
11	HEAD DIGITA	HYDERABAD, NON-U.S.	CONSUMER	PRIVATE	INDIA
12	SALESFORCE	SF BAY AREA	SALES	POST-IPO	UNITED STATES
13	ORACLE	SF BAY AREA	OTHER	POST-IPO	UNITED STATES
14	GUPSHUP	SF BAY AREA	OTHER	SERIES F	INDIA
15	BOBBLE AI	NEW DELHI,NON-U.S.	CONSUMER	UNKNOWN	INDIA
16	ORACLE	SEATTLE	OTHER	POST-IPO	UNITED STATES
17	SALESFORCE	SEATTLE	SALES	POST-IPO	UNITED STATE
18	SALESFORCE	DUBLIN,NON-U.S.	SALES	POST-IPO	UNITED STATES
19	THE GIST	TEL AVIV,NON-U.S.	OTHER	SEED	ISRAEL
20	VIMEO	NEW YORK CITY	CONSUMER	POST-IPO	UNITED STATES
21	ORACLE	KANSAS CITY	OTHER	POST-IPO	UNITED STATES
22	GAMES 24X7	MUMBAI,NON-U.S.	CONSUMER	UNKNOWN	INDIA
23	MOBILE PRE	BENGALURU,NON-U.S.	CONSUMER	SERIES E	INDIA
24	KRUTRIM	BENGALURU,NON-U.S.	Al	UNKNOWN	INDIA
25	SALESFORCE	SF BAY AREA	SALES	POST-IPO	UNITED STATE
	T				

Data type SELECT

CAST(date_added AS DATE) AS date_added FROM stg.Layoff

$\frac{\textbf{Feature Engineering}}{\textbf{SELECT}}$

YEAR(date_added) AS YEAR_date_added, MONTH(date_added) AS MONTH_date_added, DAY(date_added) AS DAY_date_added FROM stg.Layoff

⊞ R	esults	Messages		
	YEAR	_date_added	MONTH_date_added	DAY_date_added
1	2025		9	25
2	2025		9	16
3	2025		9	16
4	2025		9	15
5	2025		9	15
6	2025		9	15
7	2025		9	18
8	2025		9	8
9	2025		9	8
10	2025		9	8
11	2025		9	8
12	2025		9	8
13	2025		9	8
14	2025		9	8
15	2025		9	8
16	2025		9	8
17	2025		9	8
18	2025		9	8
19	2025		9	8
20	2025		9	8
21	2025		9	8
22	2025		9	2
23	2025		9	2
24	2025		9	2
25	2025		9	2
			-	

Feature Engineering

Extracted date parts (Year, Month, Day) for time-based analysis.

$\frac{Remove\ duplicate}{\text{with cte as }}$

```
SELECT

*,
ROW_NUMBER() OVER( PARTITION BY Company, Location, industry, Stage, country, total_laid_off, percentage_laid_off,
source, funds_raised ORDER BY date_added) AS Row_nm
FROM stg.Layoff
)
SELECT * FROM CTE
WHERE Row_nm = 1
```

⊞ R	esults 🖺 Mess	ages										
	company	location	total_laid_off	date	percentage_laid_off	industry	source	stage	funds_raised	country	date_added	Row_nm
1	#Paid	Toronto, Non-U.S.	19	2023-01-27	17%	Marketing	https://betakit.com/as-big-tech-makes-mass-layoffs-rece	Series B	21.00	Canada	2023-01-28	1
2	&Open	Dublin, Non-U.S.	9	2022-11-17	9%	Marketing	https://www.irishtimes.com/technology/2022/11/17/gifti	Series A	35.00	Ireland	2022-12-01	1
3	100 Thieves	Los Angeles	12	2022-07-13	NULL	Consumer	https://www.dexerto.com/esports/1004hieves-layoffs-so	Series C	120.00	United States	2022-07-18	1
4	100 Thieves	Los Angeles	NULL	2023-01-10	NULL	Retail	https://www.dexerto.com/esports/100-thieves-hit-with-a	Series C	120.00	United States	2023-01-12	1
5	10X Genomics	SF Bay Area	100	2022-08-04	8%	Healthcare	https://www.genomeweb.com/business-news/10x-geno	Post-IPO	242.00	United States	2022-08-04	1
6	123Milhas	Belo Horizonte,	NULL	2023-08-29	NULL	Travel	https://economia.uol.com.br/noticias/redacao/2023/08	Unkno	NULL	Brazil	2023-10-06	1
7	1K Kirana	Gurugram, Non	600	2023-04-04	40%	Retail	https://www.moneycontrol.com/news/business/startup/i	Series B	NULL	India	2023-04-04	1
8	1stdibs	New York City	70	2020-04-02	17%	Retail	https://twitter.com/eringriffith/status/124614784135076	Series D	253.00	United States	2020-04-08	1
9	23andMe	SF Bay Area	71	2023-08-08	11%	Healthcare	https://www.streetinsider.com/Corporate+News/23and	Post-IPO	1100.00	United States	2023-08-08	1
10	23andMe	SF Bay Area	75	2023-06-09	9%	Healthcare	https://www.genomeweb.com/business-news/23andme	Post-IPO	1100.00	United States	2023-06-09	1
11	23andMe	SF Bay Area	200	2024-11-11	40%	Healthcare	https://www.wsj.com/tech/biotech/23andme-to-cut-wor	Post-IPO	1100.00	United States	2024-11-12	1
12	2TM	Sao Paulo,Non	90	2022-06-01	12%	Crypto	https://www.terra.com.br/noticias/tecnologia/2tm-dono	Unkno	250.00	Brazil	2022-06-02	1
13	2TM	Sao Paulo,Non	100	2022-09-01	15%	Crypto	https://finance.yahoo.com/news/second-round-layoffs-b	Unkno	250.00	Brazil	2022-09-02	1
14	2U	Washington D.C.	NULL	2023-09-28	NULL	Education	https://2u.com/latest/organizational-changes-2u/	Post-IPO	426.00	United States	2023-09-29	1
15	2U	Washington D.C.	NULL	2024-12-04	NULL	Education	https://www.classcentral.com/report/2u-axes-trilogy-boo	Post-IPO	426.00	United States	2024-12-07	1
16	2U	Washington D.C.	NULL	2024-01-22	NULL	Education	https://www.classcentral.com/report/2u-layoffs-2024/	Post-IPO	426.00	United States	2024-01-23	1
17	2U	Washington D.C.	NULL	2025-03-31	NULL	Education	https://www.classcentral.com/report/2u-layoffs-march-2	Post-IPO	426.00	United States	2025-04-01	1
18	2U	Washington D.C.	NULL	2022-07-28	20%	Education	https://www.insidehighered.com/news/2022/08/01/onli	Post-IPO	426.00	United States	2022-07-30	1
19	54gene	Washington D.C.	95	2022-08-29	30%	Healthcare	https://techcrunch.com/2022/08/29/african-genomics-s	Series B	44.00	United States	2022-08-30	1
20	5B Solar	Sydney,Non-U.S.	NULL	2022-06-03	25%	Energy	https://www.news.com.au/finance/business/manufactu	Series A	12.00	Australia	2022-06-03	1
21	6sense	SF Bay Area	150	2022-10-12	10%	Sales	https://www.moneycontrol.com/news/business/startup/	Series E	426.00	United States	2022-10-14	1
22	7shifts	Saskatoon,Non	30	2023-09-15	7%	Food	https://www.linkedin.com/feed/update/um:li:activity:71	Series C	131.00	Canada	2023-09-21	1
23	7Shifts	Saskatoon,Non	68	2024-01-11	19%	Food	https://betakit.com/7shifts-cuts-19-percent-of-staff-in-ne	Series C	131.00	Canada	2024-01-18	1
24	80 Acres Far	Cincinnati	NULL	2023-01-18	10%	Food	https://www.bizjournals.com/cincinnati/inno/stories/ne	Unkno	275.00	United States	2023-01-19	1
25	888	Tel Aviv,Non-U	NULL	2024-01-11	NULL	Consumer	https://www.calcalistech.com/ctechnews/article/skbqy	Post-IPO	NULL	Israel	2024-01-13	1

Exploratory Data Checks

Checked for duplicates and missing values.

For the categorical

```
COALESCE(Company, 'Unknown') AS Company,
COALESCE(Location, 'Unknown') AS Location,
COALESCE(industry, 'Unknown') AS industry,
COALESCE(Stage, 'Unknown') AS Stage,
COALESCE(country, 'Unknown') AS Ccountry
FROM stg.Layoff
```

⊞ F	Results 🖺 M	essages			
	Company	Location	industry	Stage	Ccountry
1	GamesKraft	Bengaluru, Non-U.S.	Consumer	Unknown	India
2	ZipRecrui	Tel Aviv, Non-U.S.	Recruiting	Post-IPO	United
3	Fiverr	Tel Aviv, Non-U.S.	Other	Post-IPO	Israel
4	Hike	New Delhi, Non-U.S.	Consumer	Unknown	India
5	xAl	SF Bay Area	Al	Unknown	United
6	Zupee	New Delhi, Non-U.S.	Consumer	Series B	India
7	Atlassian	Sydney,Non-U.S.	Other	Post-IPO	Australia
8	Microsoft	Seattle	Other	Post-IPO	United
9	Rivian	Los Angeles	Transpo	Post-IPO	United
10	Scope3	New York City	Energy	Series B	United
11	Head Digi	Hyderabad,Non-U	Consumer	Private	India
12	Salesforce	SF Bay Area	Sales	Post-IPO	United
13	Oracle	SF Bay Area	Other	Post-IPO	United
14	GupShup	SF Bay Area	Other	Series F	India
15	Bobble Al	New Delhi, Non-U.S.	Consumer	Unknown	India
16	Oracle	Seattle	Other	Post-IPO	United
17	Salesforce	Seattle	Sales	Post-IPO	United
18	Salesforce	Dublin, Non-U.S.	Sales	Post-IPO	United
19	The Gist	Tel Aviv, Non-U.S.	Other	Seed	Israel
20	Vimeo	New York City	Consumer	Post-IPO	United
21	Oracle	Kansas City	Other	Post-IPO	United
22	Games 24	Mumbai,Non-U.S.	Consumer	Unknown	India
23	Mobile Pr	Bengaluru, Non-U.S.	Consumer	Series E	India
24	Krutrim	Bengaluru, Non-U.S.	Al	Unknown	India
25	Salesforce	SF Bay Area	Sales	Post-IPO	United
	1	1			

-- For the numeric

Data Cleaning Steps

- Replaced missing numeric values with median (e.g., total_laid_off, percentage_laid_off & funds_raised).
- Cleaned percentage fields (removed % signs, converted to numeric).
- Added flag columns to track imputed values.

Find % missing for key columns

```
COUNT(*),
SUM( CASE WHEN total_laid_off IS NULL THEN 1 ELSE 0 END) * 1.0/COUNT(*) AS total_laid_off_Missing,
SUM( CASE WHEN percentage_laid_off IS NULL THEN 1 ELSE 0 END) * 1.0/COUNT(*) AS percentage_laid_off_Missing,
SUM( CASE WHEN funds_raised IS NULL THEN 1 ELSE 0 END) * 1.0/COUNT(*) AS funds_raised_Missing
FROM stg.Layoff

Results Messages

(No column name) total_laid_off_Missing percentage_laid_off_Missing funds_raised_Missing

1 4171 0.347878206665 0.367298010069 0.111723807240
```

Check distribution (to see median & outliers) For total_laid_off

```
WITH MED AS (
SELECT
PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY total_laid_off) OVER () AS Med_total_laid_off
FROM stg.Layoff
)
SELECT * FROM MED
WHERE Med_total_laid_off IS NOT NULL
```

⊞ R	esults 📳 Message
	Med_total_laid_off
1	87
2	87
3	87
4	87
5	87
6	87
7	87
8	87
9	87
10	87
11	87
12	87

Check distribution (to see median & outliers) For percentage_laid_off

```
TRY_CAST(REPLACE( percentage_laid_off, '%', '') AS decimal(10,2)) AS Pct_num
FROM STG.Layoff
MED AS (
       SELECT
             PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY Pct_num) OVER () AS Med_Pct
FROM CLEAN
SELECT * FROM CLEAN
 Results 🔓 Messages
     Pct_num
     NULL
 2
     NULL
 3
     30.00
 4
     100.00
     NULL
 6
     30.00
 7
     NULL
 8
     NULL
 9
     1.00
 10
     NULL
 11
     NULL
 12
     NULL
```

Check distribution (to see median & outliers) For funds_raised

8

9

10

11

12

169

169

169

169

169

```
WITH MED AS (
SELECT
       PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY funds_raised) OVER () AS Med_funds_raised
FROM stg.Layoff
SELECT * FROM MED
WHERE Med_funds_raised IS NOT NULL
Results 🖺 Messages
     Med_funds_raised
     169
 2
     169
 3
     169
 4
     169
 5
     169
     169
 7
     169
```

```
-- CREATE VIEW
CREATE VIEW VW_LAYOFF AS
WITH CLEAN AS (
SELECT *,
       TRY_CAST(REPLACE( percentage_laid_off, '%', '') AS decimal(10,2)) AS Pct_num, ROW_NUMBER() OVER( PARTITION BY Company, Location, industry, Stage, country, total_laid_off, percentage_laid_off,
       source, funds_raised ORDER BY date_added) AS Row_nm
FROM stg Layoff
MED AS (
               PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY total_laid_off) OVER () AS Med_total_laid_off,
               PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY funds_raised) OVER () AS Med_funds_raised,
               PERCENTILE_CONT(0.5) WITHIN GROUP ( ORDER BY Pct_num) OVER () AS Med_Pct
FROM CLEAN
SELECT
       COALESCE(UPPER(TRIM(Company)), 'Unknown') AS Company,
COALESCE(UPPER(TRIM(Location)), 'Unknown') AS Location,
       COALESCE(UPPER(TRIM(industry)), 'Unknown') AS industry,
       COALESCE(UPPER(TRIM(Stage)), 'Unknown') AS Stage,
       COALESCE(UPPER(TRIM(country)), 'Unknown') AS Ccountry,
        YEAR(date_added) AS YEAR_date_added,
       MONTH(date_added) AS MONTH_date_added,
       DAY(date_added) AS DAY_date_added,
       CASE WHEN total_laid_off IS NULL THEN 1 ELSE 0 END AS total_laid_off_Missing,
       CASE WHEN total_laid_off IS NULL THEN 1 ELSE 0 END AS percentage_laid_off_Missing ,
       CASE WHEN funds_raised IS NULL THEN 1 ELSE 0 END AS funds_raised_Missing,
       COALESCE( total_laid_off, (SELECT TOP 1 Med_total_laid_off FROM MED)) AS imp_total_laid_off, COALESCE( total_laid_off, (SELECT TOP 1 Med_Pct FROM MED)) AS imp_percentage_laid_off,
```

```
COALESCE( funds_raised, (SELECT TOP 1 Med_funds_raised FROM MED)) AS imp_funds_raised
FROM CLEAN
WHERE Row_nm = 1
```

FULL CLEAN TABLE VIEW

SELECT * FROM VW_Layoff

	Results 🔒 Messa		-1-1-	0	C .	VEAD 11 11 1	MONTH	DAY III - II I			/	
_	Company	Location	industry	Stage	Ccountry	YEAR_date_added	MONTH_date_added	DAY_date_added		percentage_laid_off_Missing	funds_raised_Missing	imp_total_lai 📤
1	#PAID	TORONTO,NON-U.S.	MARKETING	SERIES B	CANADA	2023	1	28	0	0	0	19
2	&OPEN	DUBLIN,NON-U.S.	MARKETING	SERIES A	IRELAND	2022	12	1	0	0	0	9
3	100 THIEVES	LOS ANGELES	CONSUMER	SERIES C	UNITED STATES	2022	7	18	0	0	0	12
4	100 THIEVES	LOS ANGELES	RETAIL	SERIES C	UNITED STATES	2023	1	12	1	1	0	87
5	10X GENOMICS	SF BAY AREA	HEALTHCARE	POST-IPO	UNITED STATES	2022	8	4	0	0	0	100
6	123MILHAS	BELO HORIZONTE,NON-U.S.	TRAVEL	UNKNOWN	BRAZIL	2023	10	6	1	1	1	87
7	1K KIRANA	GURUGRAM,NON-U.S.	RETAIL	SERIES B	INDIA	2023	4	4	0	0	1	600
8	1STDIBS	NEW YORK CITY	RETAIL	SERIES D	UNITED STATES	2020	4	8	0	0	0	70
9	23ANDME	SF BAY AREA	HEALTHCARE	POST-IPO	UNITED STATES	2023	8	8	0	0	0	71
10	23ANDME	SF BAY AREA	HEALTHCARE	POST-IPO	UNITED STATES	2023	6	9	0	0	0	75
11	23ANDME	SF BAY AREA	HEALTHCARE	POST-IPO	UNITED STATES	2024	11	12	0	0	0	200
12	2TM	SAO PAULO,NON-U.S.	CRYPTO	UNKNOWN	BRAZIL	2022	6	2	0	0	0	90
13	2TM	SAO PAULO,NON-U.S.	CRYPTO	UNKNOWN	BRAZIL	2022	9	2	0	0	0	100
14	2U	WASHINGTON D.C.	EDUCATION	POST-IPO	UNITED STATES	2023	9	29	1	1	0	87
15	2U	WASHINGTON D.C.	EDUCATION	POST-IPO	UNITED STATES	2024	12	7	1	1	0	87
16	2U	WASHINGTON D.C.	EDUCATION	POST-IPO	UNITED STATES	2024	1	23	1	1	0	87
17	2U	WASHINGTON D.C.	EDUCATION	POST-IPO	UNITED STATES	2025	4	1	1	1	0	87
18	2U	WASHINGTON D.C.	EDUCATION	POST-IPO	UNITED STATES	2022	7	30	1	1	0	87
19	54GENE	WASHINGTON D.C.	HEALTHCARE	SERIES B	UNITED STATES	2022	8	30	0	0	0	95
20	5B SOLAR	SYDNEY,NON-U.S.	ENERGY	SERIES A	AUSTRALIA	2022	6	3	1	1	0	87
21	6SENSE	SF BAY AREA	SALES	SERIES E	UNITED STATES	2022	10	14	0	0	0	150
22	7SHIFTS	SASKATOON,NON-U.S.	FOOD	SERIES C	CANADA	2023	9	21	0	0	0	30
23	7SHIFTS	SASKATOON,NON-U.S.	FOOD	SERIES C	CANADA	2024	1	18	0	0	0	68
24	80 ACRES FA	CINCINNATI	FOOD	UNKNOWN	UNITED STATES	2023	1	19	1	1	0	87
∂ Γ.	000	TEL MANUADALLIC	CONCUMED	DOCT IDO	ICDAEL	2024	4	10	4	4		07

After Results

• The cleaned dataset now has unified formats, no critical nulls, and clear structure for modeling.

Conclusion

The Layoffs dataset is now fully cleaned and ready for predictive model development. All key variables have been standardized, missing values treated, and new flags added for transparency.