

Addressing Employee Attrition

**Utilizing Logistic Regression to determine
associations of employee attrition and
the effectiveness of retention initiatives**

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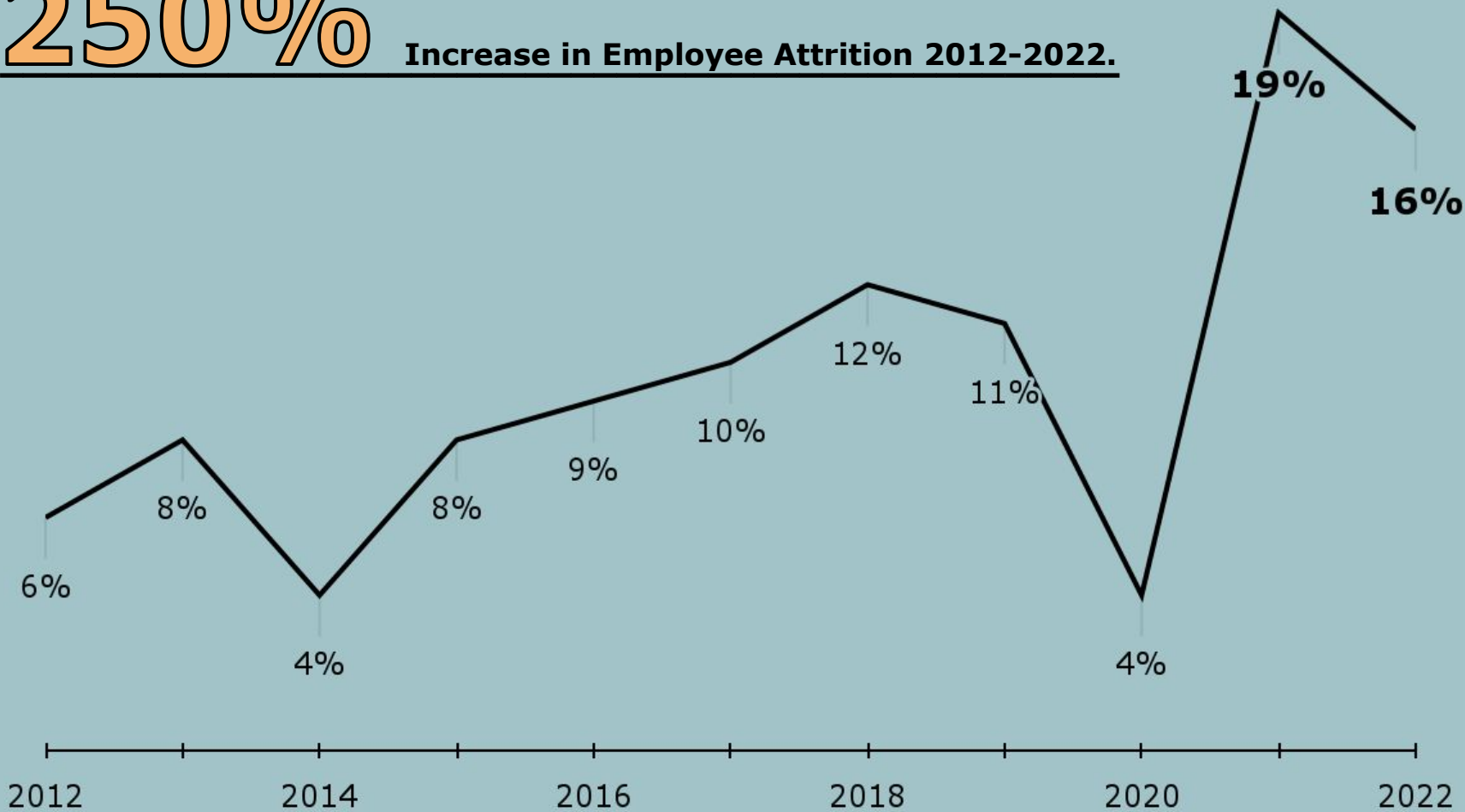
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250%

Increase in Employee Attrition 2012-2022.



3 Project Driving Questions

1. Which employees are at high attrition risk?

2. What are the root associations of attrition?

3. Which retention initiative will have the greatest impact?

Solution: Logistic Regression Model

Trained using HR employee characteristic data.

1. Which employees are at high attrition risk?



1. The model ***predicts*** attrition or retention for each employee.

2. What are the root associations of attrition?



2. The model finds which variables have the ***strongest associations with attrition.***

3. Which retention initiative will have the greatest impact?



3. The effect of each initiative can be input to the model to ***predict retention benefits.***

Objective: Minimize False Negatives

Model evaluation utilizes **false positive (FP) and false negative (FN)** counts.

FP: the model assigns “attrition” to an employee that had stayed at Acme.

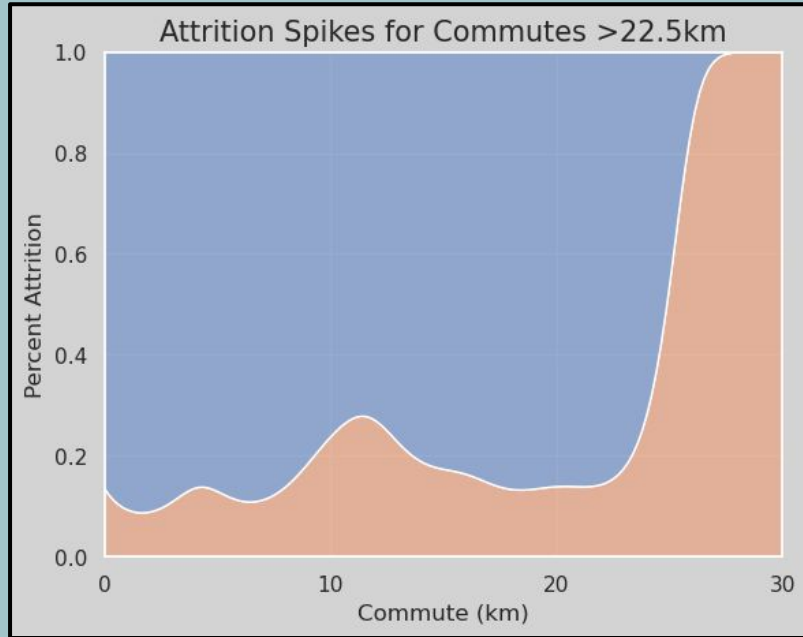
FN: the model assigns “retention” to an employee that had left Acme.

The model can minimize FP’s or FN’s, neither can be eliminated. For our goals, **minimize FN’s**.

Recall score: percentage of lost employees correctly identified.

F1 Score: high F1 scores show **model balance**, correctly identifying attrition and retention at high percentages.

In the Data: Who is Leaving Acme?



Model Evaluation: 86% Recall

Final model results:

- Correctly ID retention in 519/542 cases.
- Correctly ID attrition in 103/120 cases.
- **86% recall.**
- **84% F1 score.**

		Attrition Prediction Results	
Actual Status	Stayed	519	23
	Left	17	103
		Stayed	Left
		Predicted Status	

3 Greatest Root Associations

When controlling for other factors, attrition is...

- **2.3x** more likely *for single employees*.
- **2x** more likely for each **7.5km increase in commute**.
- **2x** more likely for every **3 years since a promotion**.

<u>Variable</u>	<u>Odds Ratio</u>	<u>Lower Estimate</u>	<u>Upper Estimate</u>
<i>Single Status</i>	2.33	1.53	3.56
<i>Commute (km)</i>	2.01	1.71	2.37
<i>Last Promotion (years)</i>	1.99	1.61	2.46

3 Recommended Action Steps

- 1. **Implement** and maintain **this model**.
- 2. Select the **"Limit business travel"** initiative.
- 3. Hire individuals:
 - a. **Within 22km.**
 - b. **Not of single marital status.**
 - c. That hiring managers note have **promotion potential**, if possible.

<u>Retention Initiative</u>	<u>Retention / Savings</u>
Increased base pay	1 employee/₹30k
Additional professional development	4 employees/₹120k
Workplace flexibility	6 employees/₹180k
Employee appreciation	9 employees/₹270k
Limit business travel	15 employees/₹450k

Special Consideration:
"Workplace flexibility" may have further benefits, considering the association of commute distance with attrition.

Potential Limitations

Data limitations:

- **Missing values** in dataset.
- **Class imbalance** (16% attrition 84% retention).

Model limitations:

- Logistic regression **does not determine a causal relationship.**
- This model is trained on **historic data.**

Even with these limitations, this model gains us significant insight into the growing attrition issue.

3 Project Driving Questions: Answered

1. Which employees are at high attrition risk?

The model correctly identifies attrition in 5/6 cases.

2. What are the root associations of attrition?

Single status, long commutes, & years since promotion.

3. Which retention initiative will have the greatest impact?

"Limit business travel" initiative, ₹450k estimated savings.