

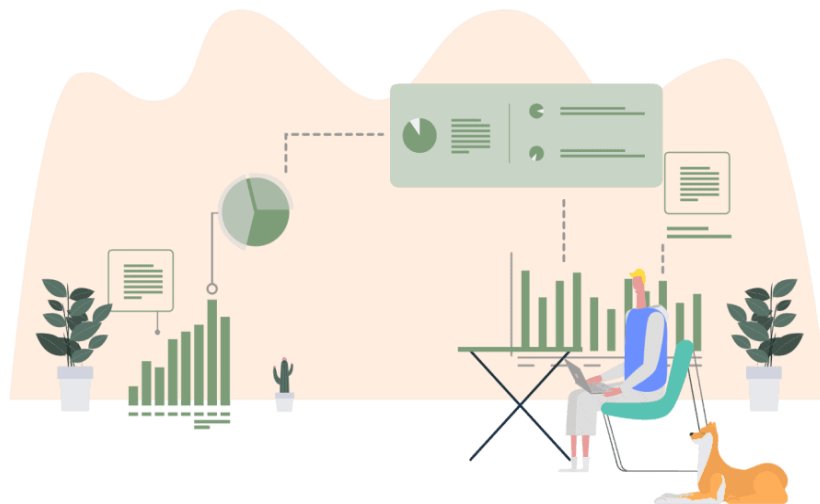
# **People Analytics Project on**

**Factors affecting**

**Employees Performance**

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## **II. Abstract**

Employee performance can be impacted by various factors. One of the factors that has been playing an important role in employee work performance since COVID-19 is the opportunity to work remotely. Our study will try to determine whether performance may or may not depend on personal factors such as gender, marital status or mode of work (remote, hybrid or in-person). Our study involves surveying family, friends and colleagues to assess the results against our hypothesis that personal factors DO NOT affect employee performance. The survey included participants from two main countries, India and the United States, as well as, minimal participation from Canada and Czechia and age varied from 13-70+.

## **III. Introduction**

What causes work performance to vary? Can work performance be tied to any one cause? Or is work performance caused by factors within each individual employee's personal life? The purpose of this paper is to find out if a given group of surveyed individuals can help determine if one of the handfuls of determinants answered by completing our survey in order to help us understand more about individual work performance.

It is always surprising to learn that certain assumptions can be made about such common themes such as work performance. One could almost assume that work performance is related solely to experience, but everyone knows what making assumptions does... just because you prepare very well for an exam or job interview, it could go completely different from what you were expecting. This unexpected result could

be attributed to a myriad of causes, such as, the professors exam types, an error in the course materials, a time mix up in the scheduled interview time, and so forth.

Our survey starts by asking basic personal data questions regarding age, gender, marital status, city and country of inhabitants, years of work experience and mode of working. The next set of questions are geared towards preference and perspective and focus on a set of tests against the hypothesis in order to extrapolate the necessary data to make a conclusion. We also move into preferences and perspectives on self reported work performance. The work performance survey measurement is not quantified objectively from the outside but more from an individual personal assessment. Each individual must make a decision whether or not their performance is being affected by their personal factors, preference, both or neither.

#### IV. Hypothesis

We thought for the purpose of testing our hypothesis we should include the fact that individual work landscapes have changed significantly over the last few years and we included the mode of work as a function as well as a preference for the purpose of gathering more in depth data.

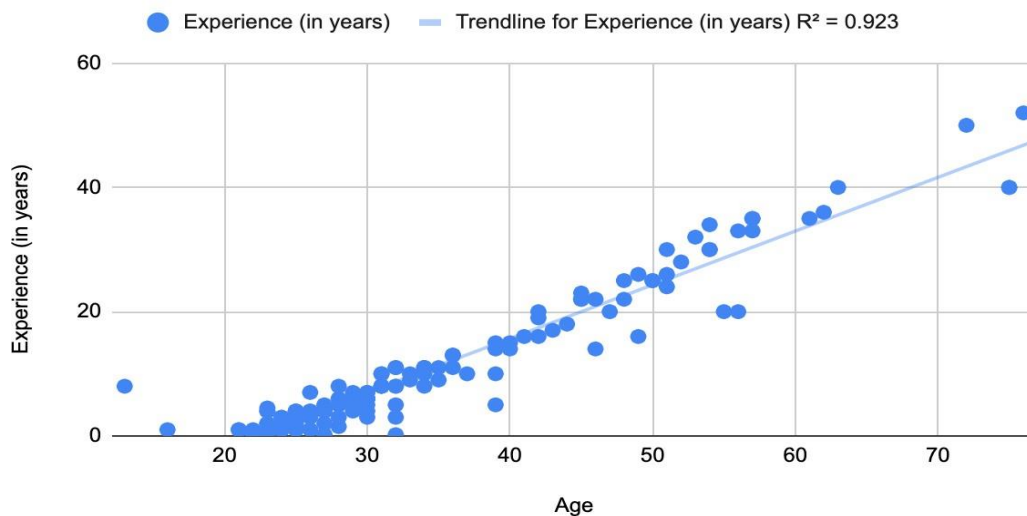
Our Null Hypothesis states: **Employee's personal factors do not affect employee's on-site performance and/or remote performance.**

We also state our Alternative Hypothesis as: **Employee's personal factors do affect employee's on-site performance and remote performance.**

## V. Method(s) / Tools

Our goal was to assess performance analysis when working in-person, remotely, or in a hybrid environment. We will need the following tools and methods to do this. The initial step was to identify participants who might respond to our questionnaire without bias. Essentially, our objective was to determine a target audience for this survey. We subsequently developed a series of questionnaires that could be implemented in our survey to collect all the responses. To conduct statistical analysis of the data we used SPSS to perform several sorts of analytics on the data we gathered. We used Tableau to visualize the results and performed factor analysis and regression analysis. Regression analysis will help us to find a correlation between two variables and be able to find strong (positive) or weak (negative) relationships for defined variables. For example:

Fig Experience (in years) vs. Age 1:



Scatter plot for Experience vs Age

Factor analysis will help us to find different survey questions and analyze the answers. This will also help us to group the questions based on the trend of response. This analysis examines the pattern of responses of respondents to questionnaire items to see if the responses follow a particular pattern. If responses to certain sets of questions tend to cluster together, this indicates that the items are measuring a construct. ***Please refer to the factor analysis section for more information.***

The figures on the factor analysis table show the loadings of each item on each factor after rotation. This table contains the rotated factor loadings, showing both how the variables are weighted for each factor but also the correlation between the variables and factors. Because these are correlations then the possible values range from -1 to +1. On the format subcommand, we used the option blank (0.30), which tells SPSS not to print any of the correlations values that are less than 0.3. This removes the clutter of low correlations that are probably not meaningful anyway and makes the output more readable. You can see that each of the components with loadings that are greater than 0.60. This gives you information about what items are usually loaded together into factors. However, we exclude the variables with responses, where both components have load values of 0.5 at the same time. So, the final derived factors are:

- **Group 1:**
  - Overall Work Performance increases while working from home.
  - People can collaborate and work even while working from home.
  - My work performance is high when working from home.

- Working from home benefits both employees and company.
- **Group 2:**
  - Working remotely allows one to attend to the needs of a family and/or pets, positively impacting their work performance.
  - Myself and/or my team should be able to decide when to work from home and when to work in-person.
  - While working from home I get to take short breaks more than during in-person, which refreshes the mind and positively impacts the performance.
  - Remote work saves money and positively impacts morale and performance.
  - If my company made in-person working mandatory, I would consider switching to a different job.
- **Group 3:**
  - In person work events conducted throughout the year help increase the performance more so than remote events.
  - In person work environments allow for impromptu collaboration between teams and individuals, more so than remote work.
  - Remote meetings are ineffective and eventually reduce work performance.
- **Group 4:**
  - My performance is not dependent on working from home.

The questions which did not contribute much to measuring the factors because the responses are too scattered, or the rotated value is 0.5 are:

- I currently work in-person, but I would prefer to be able to work remotely.
- Commuting to the office is stressful and negatively impacts my performance.
- Working from home creates too many distractions which reduces work performance.
- Prolonged work from home can decrease performance.

## VI. Participants

The survey collected total number of #137 respondents. Here is the distribution of the data.

- **Geographical Location:** As part of the data collection process, we tried to collect the dataset from different regions of the world to analyze the people's mindset and different industries.

Our major respondents are from India and the United states of America.

Geographical Location	
Canada	1
Czechia	1
India	75
United States	60
<b>Total</b>	<b>137</b>

Fig 2: Data distribution across different Geographical Locations

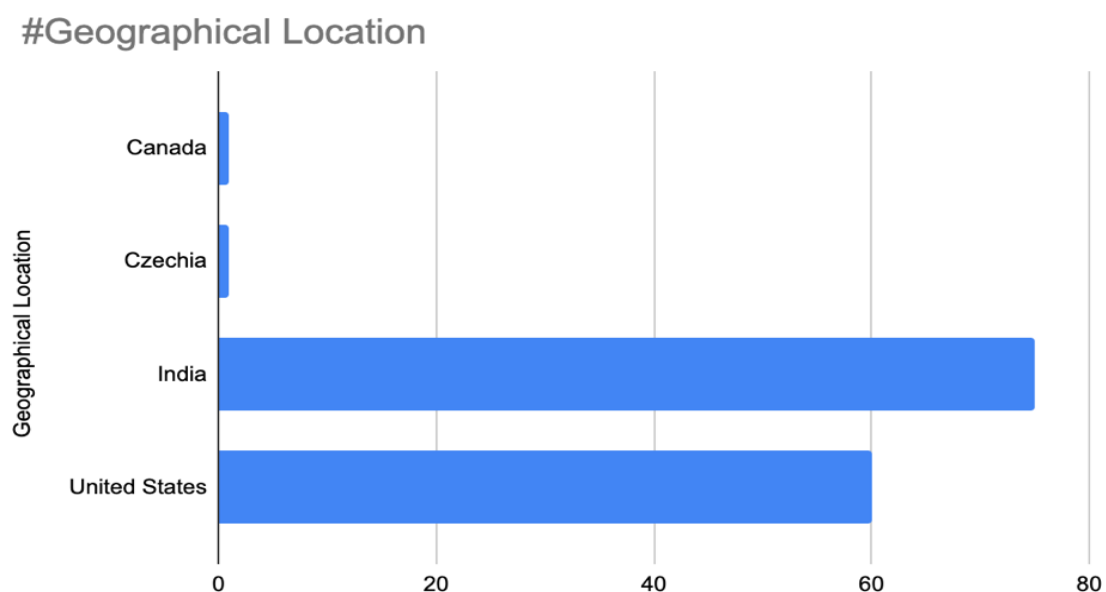


Fig 3: Bar Plot for data across different Geographical Locations

- **Gender:** We collected gender information as part of our survey. It was a mixture of Female and Male ratio.

Gender	
Male	Female
85	42

Fig 4: Data distribution for gender

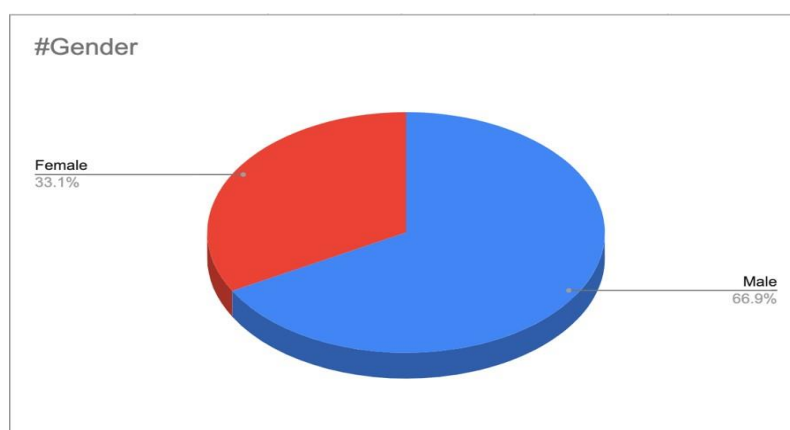


Fig 5: Pie Chart for gender distribution



- **Age distribution:** During our survey, we wanted to identify the age too. This can help us to analyze what people think about performance while working from home based on their age.

Age Distribution	
Bucket	Frequency
10	2
20	61
30	33
40	19
50	14
60	7

Fig 6: Data for Age distribution

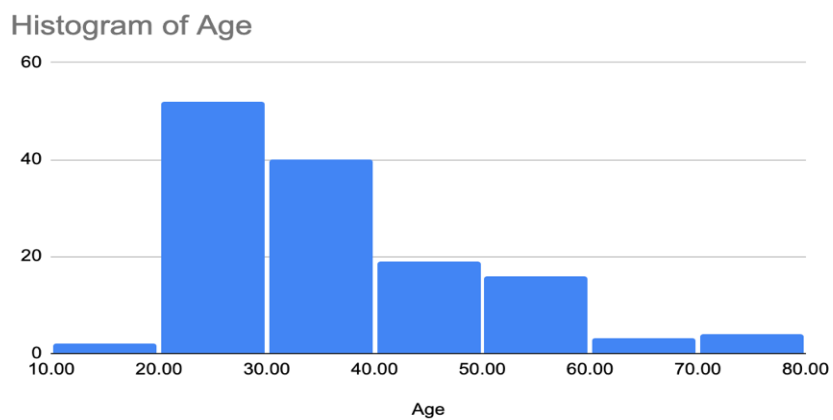


Fig 7: Histogram for age distribution

- **Current mode of working:** Our survey also captured the current mode of working condition.

Current mode of working	
Remote	37
In-Person	61
Hybrid	38

Fig 8: Data distribution for current mode of working

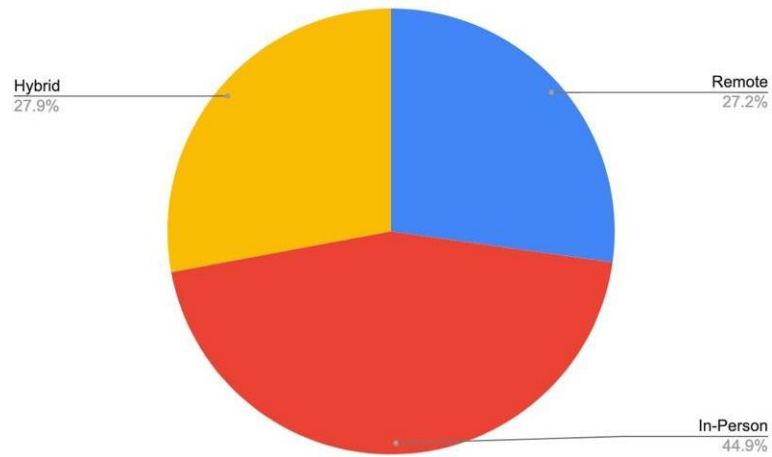


Fig 9: Pie Chart for Current mode of Working distribution

- **Marital status:** Our survey also covered about Marital status also based on the total population of the dataset.

Marital Status	
Married	81
Single	55

Fig 10: Data distribution for Marital status

## **VII. Results & Analysis**

### **A. Factor Analysis Involving 4 Factors:**

- **Component 1 - Work from home performance**
- **Component 2 - Work life balance**
- **Component 3 : OnSite - On Site Work Performance**
- **Component 4 : Neutral**

#### **Factor analysis:**

Factor analysis for us is about taking several different survey questions and analyzing whether the answers seem to measure the expected variable. Analysis examines the pattern of responses of respondents to questionnaire items to see if the responses follow a particular pattern. If responses to certain sets of questions tend to cluster together, this indicates that the items are measuring a construct.

#### **Procedures:**

Steps that yielded results were performed using RSSP factor analysis functions. (See Below)

## Result of Analysis: Total Variance Explained

Total Variance Explained						
Component	Initial Eigenvalues			Extraction Sums of Squared Loadings		
	Total	% of Variance	Cumulative %	Total	% of Variance	Cumulative %
1	7.086	39.364	39.364	7.086	39.364	39.364
2	1.845	10.251	49.615	1.845	10.251	49.615
3	1.405	7.804	57.419	1.405	7.804	57.419
4	1.128	6.267	63.686	1.128	6.267	63.686
5	.835	4.642	68.328			
6	.802	4.457	72.785			
7	.675	3.750	76.535			
8	.630	3.503	80.038			
9	.618	3.434	83.472			
10	.535	2.972	86.443			
11	.464	2.579	89.023			
12	.429	2.382	91.405			
13	.400	2.223	93.628			
14	.366	2.032	95.660			
15	.306	1.702	97.361			
16	.257	1.425	98.786			
17	.218	1.214	100.000			
18	-9.410E-16	-5.228E-15	100.000			

Fig 11: Total Variance Table

When SPSS generates a new component (a group measure such as relatedness), it calculates the correlation that each item has with that component. These are called "factor loadings". To determine which components should be included, SPSS calculates the square of the factor loadings and then adds them together to obtain what is known as an intrinsic value. As a rule of thumb, if the eigenvalue is greater than one, Then that means we have a factor that we can use. If it is less than one, this grouping of objects does not correspond to a meaningful structure.

You can see that SPSS has calculated the eigenvalues for each of the 16 factors. Only the first four factors have eigenvalues greater than one, so let's ignore the rest. Looking at component 1 it has a total eigenvalue of 7.086 and accounts for 39.364 per cent of variance in the items. Component 2 has a total eigenvalue of 1.845 and accounts for 10.251 per cent of the variance in the items. Component 3 has a total eigenvalue of 1.405 and accounts for 7.804 percent of variance in the items. The Component 4 has the eigenvalue of 1.128 and accounts for 6.267 percent of variance in the items.

Looking at the Four together, the cumulative percentage value tells us that they account for 63.686 of the variances in all the items.

The next step is to identify which items (questions) load together into which factors. This is where the subsequent rotated component matrix comes in .

#### **Result of Analysis: Rotated Component Matrix:**

Rotated Component Matrix <sup>a</sup>				
	Component			
	1	2	3	4
Overall Work Performance increases while working from home	.868	.302		
SMEAN (Overall Work Performance increases while working from home)	.868	.302		
People can collaborate and work even while working from home	.760			
My work performance is high when working from home	.704			.344
Working from home benefits both employees and company	.588	.394		.446
I currently work in-person but I would prefer to be able to work remotely.	.505			.501
Working remotely allows one to attend to the needs of a family and/or pets, positively impacting their work performance		.785		
Myself and/or my team should be able to decide when to work from home and when to work in-person		.700		.331
Remote work saves money and positively impacts morale and performance		.676		.393
If my company made in-person working mandatory, I would consider switching to a different job		.634		

Fig 12: Rotated Component Matrix Table

**Rotated Component Matrix<sup>a</sup>**

	Component			
	1	2	3	4
While working from home I get to take short breaks more than during in-person, which refreshes the mind and positively impacts the performance	.318	.587		
Commuting to office is stressful and impacts negatively my performance	.449	.564		
In person work events conducted throughout the year help increase the performance more so than remote events			.765	
In person work environments allow for impromptu collaboration between teams and individuals, more so than remote work.			.650	
Remote meetings are ineffective and eventually reduce work performance			.648	
Prolonged work from home can decrease performance	-.547		.556	
Working from home contributes creates too many distractions which reduces work performance	-.524		.529	
My performance is not dependent on working from home				.815

Extraction Method: Principal Component Analysis.

Rotation Method: Varimax with Kaiser Normalization.

a. Rotation converged in 5 iterations.

Fig 13: Rotated Component Matrix cont.

The figures above show the loadings of each item on each factor after rotation.

This table contains the rotated factor loadings, showing both how the variables are weighted for each factor but also the correlation between the variables and factors. Because these are correlations then the possible values range from -1 to +1. On the format subcommand, we used the option blank (0.30), which tells spss not to print any of the correlations values that are less than 0.3. This removes the clutter of low correlations that are probably not meaningful anyway and makes the output more readable

You can see that each of the components with loadings that are greater than 0.60. This gives you information about what items are usually load together into factors. However, we exclude the variables with responses, where both components have load values of 0.5 at the same time. So the final derived factors are

**Group1:**

1. Overall Work Performance increases while working from home
2. People can collaborate and work even while working from home
3. My work performance is high when working from home
4. Working from home benefits both employees and company

**Group2 :**

1. Working remotely allows one to attend to the needs of a family and/or pets, positively impacting their work performance
2. Myself and/or my team should be able to decide when to work from home and when to work in-person
3. While working from home I get to take short breaks more than during in-person, which refreshes the mind and positively impacts the performance



4. Remote work saves money and positively impacts morale and performance
5. If my company made in-person working mandatory, I would consider switching to a different job

**Group 3 :**

1. In person work events conducted throughout the year help increase the performance more so than remote events
2. In person work environments allow for impromptu collaboration between teams and individuals, more so than remote work.
3. Remote meetings are ineffective and eventually reduce work performance

**Group 4 :**

1. My performance is not dependent on working from home

**Remaining Survey questions**

The questions below did not contribute to measuring the factors because the responses are too scattered (the rotated value or below 0.5)

1. I currently work in-person but I would prefer to be able to work remotely.
2. Commuting to office is stressful and impacts negatively my performance
3. Working from home contributes creates too many distractions which reduces work performance
4. Prolonged work from home can decrease performance

**B. Chi-Square Test**

We are performing our Chi square test on the Null Hypothesis (Ho) "Employees personal factors do not affect employees on-site performance and remote performance". We took

Gender, Experience and Marital Status as a personal factor and tested it against Work from Home Performance and On-site Performance.

## Chi-Square Analysis on Gender vs. Performance

### *Gender vs Work from Home Performance*

In the crosstab of our output of Chi-square analysis, we can see out of 137, the total number of women are 51 (37.2%) and total number of men are 81 (62.8%) in our survey. While working from home, 16% of employees who reported Poor Performance and 20% of employees who reported Very Poor Performance were women. Whereas 84% and 80% of employees reported poor and very poor performance respectively were men. Our chi square value is 9.664 with 4 as a freedom of degree and the p-value for this analysis is 0.046 which is less than 0.05. So, our observed results are statistically significant than expected value. Hence, we will reject our Null Hypothesis. ( $\chi^2 = 9.664$ ,  $df = 4$ ,  $p < 0.046$ )

			Overall Work Performance while working from home					
			Very Good	Good	Moderate	Poor	Very Poor	Total
Gender	0	Count	8	21	16	4	2	51
		Expected Count	7.8	15.3	14.9	9.3	3.7	51.0
		% within Gender	15.7%	41.2%	31.4%	7.8%	3.9%	100.0%
		% within Overall Work Performance while working from home	38.1%	51.2%	40.0%	16.0%	20.0%	37.2%
		% of Total	5.8%	15.3%	11.7%	2.9%	1.5%	37.2%
	1	Count	13	20	24	21	8	86
		Expected Count	13.2	25.7	25.1	15.7	6.3	86.0
		% within Gender	15.1%	23.3%	27.9%	24.4%	9.3%	100.0%
		% within Overall Work Performance while working from home	61.9%	48.8%	60.0%	84.0%	80.0%	62.8%
		% of Total	9.5%	14.6%	17.5%	15.3%	5.8%	62.8%
Total	Count	21	41	40	25	10	137	
	Expected Count	21.0	41.0	40.0	25.0	10.0	137.0	
	% within Gender	15.3%	29.9%	29.2%	18.2%	7.3%	100.0%	
	% within Overall Work Performance while working from home	100.0%	100.0%	100.0%	100.0%	100.0%	100.0%	

Chi-Square Tests					
Chi-Square	11.30				
df	4				
Asymp. Sig.	.027				
Exact Sig.					
2x4					
Exact	.032				

Fig 14: Chi-Square Test for Overall Work Performance while working from home (Gender

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	9.664 <sup>a</sup>	4	.046
Likelihood Ratio	10.324	4	.035
Linear-by-Linear Association	5.223	1	.022
N of Valid Cases	137		
a. 1 cells (10.0%) have expected count less than 5. The minimum expected count is 3.72.			

### Gender vs On-site Performance

In the crosstab of our output of Chi-square analysis, we can see out of 137, the total number of women are 51 (37.2%) and total number of men are 81 (62.8%) in our survey. While working On-Site, 29.4% of employees who reported Poor Performance and 33.3% of employees who reported Very Poor Performance were women. Whereas 70.6% and 66.7% of employees who reported poor and very poor performance respectively were men. Our chi square value is 1.653 with 4 as a freedom of degree and the p-value for this analysis is 0.799 which is more than 0.05. So, our observed results are not statistically significantly different from the expected value. Hence, we fail to reject the Null Hypothesis. ( $\chi^2 = 1.653$ ,  $df = 4$ ,  $p < 0.799$ )

		Overall Work Performance while working On-Site						
		Very Good	Good	Moderate	Poor	Very Poor	Total	
Gender	0	Count	10	24	11	5	1	51
		Expected Count	8.6	22.0	13.0	6.3	1.1	51.0
		% within Gender	19.6%	47.1%	21.6%	9.8%	2.0%	100.0%
		% within Overall Work Performance while working On-Site	43.5%	40.7%	31.4%	29.4%	33.3%	37.2%
		% of Total	7.3%	17.5%	8.0%	3.6%	0.7%	37.2%
1	Count	13	35	24	12	2	86	
	Expected Count	11.4	28.0	13.0	6.3	1.1	86.0	
	% within Gender	15.1%	40.7%	21.6%	9.8%	2.0%	100.0%	
	% within Overall Work Performance while working On-Site	31.4%	40.7%	31.4%	29.4%	33.3%	62.8%	
	% of Total	9.5%	25.5%	17.5%	8.8%	1.4%	62.8%	
Total		Count	23	59	35	17	3	137
		Expected Count	20.0	48.0	26.0	12.6	2.4	137.0
		% within Gender	78.3%	81.3%	74.3%	74.1%	78.3%	100.0%
		% within Overall Work Performance while working On-Site	66.7%	81.3%	74.3%	74.1%	78.3%	100.0%
		% of Total	16.8%	42.3%	25.5%	12.4%	2.1%	100.0%

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	1.653 <sup>a</sup>	4	.799
Likelihood Ratio	1.670	4	.796
Linear-by-Linear Association	1.360	1	.244
N of Valid Cases	137		

a. 2 cells (20.0%) have expected count less than 5. The minimum expected count is 1.12.

Fig 15: Chi-Square Test for Overall Work Performance while working on-site (Gender)

## Chi-Square Analysis on Experience vs. Performance

### *Experience vs Work from Home Performance*

8.3% and 33.3% of the employees with 1 year of experience reported very good and good performance while working from home . Whereas 25% and 50% employees with 4 years of experience reported very good and good performance while working from home. Our chi square value is 158.711 with 164 as a freedom of degree and the p-value for this analysis is 0.602 which is more than 0.05. So, our observed results are not statistically significantly different from the expected value. Hence, we fail to reject the Null Hypothesis.

( $\chi^2 = 158.711$ ,  $df = 164$ ,  $p < 0.602$ )

		Overall Work Performance while working from home					
		Very Good	Good	Moderate	Poor	Very Poor	Total
1	Count	1	4	5	2	0	12
	Expected Count	1.8	3.6	3.5	2.2	.9	12.0
	% within Experience (in years)	8.3%	33.3%	41.7%	16.7%	0.0%	100.0%
	% within Overall Work Performance while working from home	4.8%	9.8%	12.5%	8.0%	0.0%	8.8%
	% of Total	0.7%	2.9%	3.6%	1.5%	0.0%	8.8%
4	Count	3	6	2	1	0	12
	Expected Count	1.8	3.6	3.5	2.2	.9	12.0
	% within Experience (in years)	25.0%	50.0%	16.7%	8.3%	0.0%	100.0%
	% within Overall Work Performance while	14.3%	14.6%	5.0%	4.0%	0.0%	8.8%
							8.8%

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	158.711 <sup>a</sup>	164	.602
Likelihood Ratio	162.286	164	.523
Linear-by-Linear Association	3.505	1	.061
N of Valid Cases	137		

a. 210 cells (100.0%) have expected count less than 5. The minimum expected count is .07.

Fig 16: Chi-Square Test for Overall Work Performance while working from home (Experience)

### Experience vs On-site Performance

While working On-Site, 8.3% and 50% of the employees with 1 year of experience reported very good and good performance. Whereas 16.7% and 50% employees with 4 years of experience reported very good and good performance while working from home. Our chi square value is 130.865 with 164 as a freedom of degree and the p-value for this analysis is 0.973 which is more than 0.05. So, our observed results are not statistically significantly different from the expected value. Hence, we fail to reject the Null Hypothesis. ( $\chi^2 = 130.865$ ,  $df = 164$ ,  $p < 0.973$ )

		Overall Work Performance while working On-Site					
		Very Good	Good	Moderate	Poor	Very Poor	Total
1	Count	1	6	4	1	0	12
	Expected Count	2.0	5.2	3.1	1.5	.3	12.0
	% within Experience (in years)	8.3%	50.0%	33.3%	8.3%	0.0%	100.0%
	% within Overall Work Performance while working On-Site	4.3%	10.2%	11.4%	5.9%	0.0%	8.8%
	% of Total	0.7%	4.4%	2.9%	0.7%	0.0%	8.8%
4	Count	2	6	3	1	0	12
	Expected Count	2.0	5.2	3.1	1.5	.3	12.0
	% within Experience (in years)	16.7%	50.0%	25.0%	8.3%	0.0%	100.0%
	% within Overall Work Performance while working On-Site	8.7%	10.2%	8.6%	5.9%	0.0%	8.8%
	% of Total	1.5%	4.4%	2.2%	0.7%	0.0%	8.8%

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	130.865 <sup>a</sup>	164	.973
Likelihood Ratio	129.136	164	.980
Linear-by-Linear Association	.728	1	.393
N of Valid Cases	137		
a. 208 cells (99.0%) have expected count less than 5. The minimum expected count is .02.			

Fig 17: Chi-Square Test for Overall Work Performance while working on-site (Experience)

## Chi-Square Analysis on Experience vs. Performance

Out of all the surveyed employees 40.9% were unwed and 59.1% were married.

### *Marital Status vs Work from Home Performance*

In the crosstab of our output of Chi-square analysis, we can see out of 137, the total number of unmarried respondents are 56 (40.9%) and total number of married respondents are 81 (59.1%) in our survey. 17.9% and 30.4% of the unwed employees reported very good performance and good performance respectively. Although quite close but 13.6% and 29.6% of the married employees reported very good performance and good performance respectively while working from home. Our chi square value is 1.180 with 4 as a freedom of degree and the p-value for this analysis is 0.881 which is less than 0.05. So, our observed results are statistically significantly different than expected value. Hence, we will reject our Null Hypothesis. ( $\chi^2 = 1.18$  ,  $df=4$  ,  $p < 0.881$  )

			Overall Work Performance while working from home					Total
			Very Good	Good	Moderate	Poor	Very Poor	
Marital Status	Single	Count	10	17	17	9	3	56
		Expected Count	8.6	16.8	16.4	10.2	4.1	56.0
		% within Marital Status	17.9%	30.4%	30.4%	16.1%	5.4%	100.0%
		% within Overall Work Performance while working from home	47.6%	41.5%	42.5%	36.0%	30.0%	<b>40.9%</b>
		% of Total	7.3%	12.4%	12.4%	6.6%	2.2%	40.9%
	Married	Count	11	24	23	16	7	81
		Expected Count	12.4	24.2	23.6	14.8	5.9	81.0
		% within Marital Status	13.6%	29.6%	28.4%	19.8%	8.6%	100.0%
		% within Overall Work Performance while working from home	52.4%	58.5%	57.5%	64.0%	70.0%	<b>59.1%</b>
		% of Total	8.0%	17.5%	16.8%	11.7%	5.1%	59.1%
Total		Count	21	41	40	25	10	137
		Expected Count	21.0	41.0	40.0	25.0	10.0	137.0
		% within Marital Status	15.3%	29.9%	29.2%	18.2%	7.3%	100.0%
		% within Overall Work	100.0%	100.0%	100.0%	100.0%	100.0%	100.0%

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	1.180 <sup>a</sup>	4	.881
Likelihood Ratio	1.196	4	.879
Linear-by-Linear Association	.957	1	.328
N of Valid Cases	137		
a. 1 cells (10.0%) have expected count less than 5. The minimum expected count is 4.09.			

Fig 17: Chi-Square Test for Overall Work Performance while working from home (Marital Status)

### Marital Status vs On-site Performance

In the crosstab of our output of Chi-square analysis, we can see out of 137, the total number of unmarried respondents are 56 (40.9%) and total number of married respondents are 81 (59.1%) in our survey. While working On-Site 14.3% and 50% of the Unmarried employees reported very good performance and good performance respectively. Whereas 18.5% and 38.4% of the married employees reported very good performance and good performance respectively. Our chi square value is 3.085 with 4 as a freedom of degree and the p-value for this analysis is 0.544 which is less than 0.05. So, our observed results are statistically significantly different than expected value. Hence, we will reject our Null Hypothesis. ( $\chi^2 = 3.085$ ,  $df=4$ ,  $p<0.544$ )



			Overall Work Performance while working On-Site					Total
			Very Good	Good	Moderate	Poor	Very Poor	
Marital Status	Single	Count	8	28	12	6	2	56
		Expected Count	9.4	24.1	14.3	6.9	1.2	56.0
		% within Marital Status	14.3%	50.0%	21.4%	10.7%	3.6%	100.0%
		% within Overall Work Performance while working On-Site	34.8%	47.5%	34.3%	35.3%	66.7%	40.9%
		% of Total	5.8%	20.4%	8.8%	4.4%	1.5%	40.9%
	Married	Count	15	31	23	11	1	81
		Expected Count	13.6	34.9	20.7	10.1	1.8	81.0
		% within Marital Status	18.5%	38.3%	28.4%	13.6%	1.2%	100.0%
		% within Overall Work Performance while working On-Site	65.2%	52.5%	65.7%	64.7%	33.3%	59.1%
		% of Total	10.9%	22.6%	16.8%	8.0%	0.7%	59.1%
Total	Count		23	59	35	17	3	137
	Expected Count		23.0	59.0	35.0	17.0	3.0	137.0
	% within Marital Status		16.8%	43.1%	25.5%	12.4%	2.2%	100.0%
	% within Overall Work Performance while working On-Site		100.0%	100.0%	100.0%	100.0%	100.0%	100.0%

Chi-Square Tests			
	Value	df	Asymptotic Significance (2-sided)
Pearson Chi-Square	3.085 <sup>a</sup>	4	.544
Likelihood Ratio	3.078	4	.545
Linear-by-Linear Association	.007	1	.932
N of Valid Cases	137		
a. 2 cells (20.0%) have expected count less than 5. The minimum expected count is 1.23.			

Fig 18: Chi-Square Test for Overall Work Performance while working on-site (Marital Status)



### C. Regression Analysis:

Regression Analysis was performed to check if certain variables had any impact on the topic of interest.

The two important factors to consider in a Regression Analysis are below:

Dependent Variable: Main factor that you are trying to understand or predict

Independent Variable: Factors that we hypothesize have an impact on the dependent variable

Two regression analyses were performed. One on 'Overall Work Performance while working from home' and the other on 'Overall Work Performance while working On-Site'

#### Analysis for Overall Work Performance while working from home:

Independent Variables: Age, Experience (in years)

Dependent Variable: Overall Work Performance while working from home

Variables Entered/Removed <sup>a</sup>			
Model	Variables Entered	Variables Removed	Method
1	Experience (in years), Age <sup>b</sup>	.	Enter

a. Dependent Variable: Overall Work Performance while working from home

b. All requested variables entered.

Fig 19: Variables Entered

**Model Summary**

Model	R	R Square	Adjusted R Square	Std. Error of the Estimate
1	.180 <sup>a</sup>	.033	.018	1.145

a. Predictors: (Constant), Experience (in years), Age

Fig 20: Model Summary

**ANOVA<sup>a</sup>**

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	5.818	2	2.909	2.219	.113 <sup>b</sup>
	Residual	173.042	132	1.311		
	Total	178.859	134			

a. Dependent Variable: Overall Work Performance while working from home

b. Predictors: (Constant), Experience (in years), Age

Fig 21: Analysis of Variance

**Coefficients<sup>a</sup>**

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.
		B	Std. Error	Beta		
1	(Constant)	3.126	.669		4.674	<.001
	Age	-.026	.028	-.278	-.908	.366
	Experience (in years)	.044	.031	.429	1.404	.163

a. Dependent Variable: Overall Work Performance while working from home

Fig 22: Coefficients Table

**Result of Analysis:** The hypothesis tests if employee performance doesn't depend on an employee's personal factors. The dependent variable '**Overall Work Performance while working from home**' was regressed on predicting variables like Age and Experience (in years). The F-value is 2.219 and R-square value is 0.033 (3.3%) which indicates there is no significant relation between the Dependent and Independent variables. The p-value is 0.113 which is greater than 0.05, indicating this model cannot be used.

### Analysis Overall Work Performance while working On-Site:

Independent Variables: Age, Experience (in years)

Dependent Variable: Overall Work Performance while working On-Site

Variables Entered/Removed <sup>a</sup>			
Model	Variables Entered	Variables Removed	Method
1	Experience (in years), Age <sup>b</sup>	.	Enter

a. Dependent Variable: Overall Work Performance while working On-Site

b. All requested variables entered.

Fig 23: Variables Entered

Model Summary				
Model	R	R Square	Adjusted R Square	Std. Error of the Estimate
1	.095 <sup>a</sup>	.009	-.006	.983

a. Predictors: (Constant), Experience (in years), Age

Fig 24: Models Summary

**ANOVA<sup>a</sup>**

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	1.167	2	.584	.605	.548 <sup>b</sup>
	Residual	127.425	132	.965		
	Total	128.593	134			

a. Dependent Variable: Overall Work Performance while working On-Site  
b. Predictors: (Constant), Experience (in years), Age

Fig 25: Analysis of Variance

**Coefficients<sup>a</sup>**

Model		Unstandardized Coefficients		Standardized Coefficients		
		B	Std. Error	Beta	t	Sig.
1	(Constant)	1.941	.574		3.382	<.001
	Age	.022	.024	.286	.925	.357
	Experience (in years)	-.028	.027	-.326	-1.054	.294

a. Dependent Variable: Overall Work Performance while working On-Site

Fig 26: Coefficients Table

**Result of Analysis:** The hypothesis tests if employee performance doesn't depend on an employee's personal factors. The dependent variable '**Overall Work Performance while working On-Site**' was regressed on predicting variables like Age and Experience (in years). The F-value is 1.035 and R-square value is 0.009 (0.9%) which indicates there is no significant relation between the Dependent and Independent variables. The p-value is 0.548 which is greater than 0.05, indicating this model cannot be used.

## **D. One-way ANOVA**

We have performed one way ANOVA analysis on four combinations as listed below:

We tried ANOVA with whatever variable we used because 1 way ANOVA is used when we have one categorical independent variable having more than 3 categories, and one quantitative dependent variable.

The columns actual mode of working and preferred mode of working qualifies for the independent variable criteria and performance while work from home is continuous variable so we took it as the dependent variable in our one-way analysis.

In the first analysis, we established the null hypothesis that all the work modes have the same means and are statistically significant.

### **Preferred mode of working VS Overall work performance increase while working from home**

The significance value is ( $F_{2, 134} = 27.254$ ,  $p < .001$ ) we reject the null hypothesis and conclude that the means are different and there is a statistically significant difference between our group means.

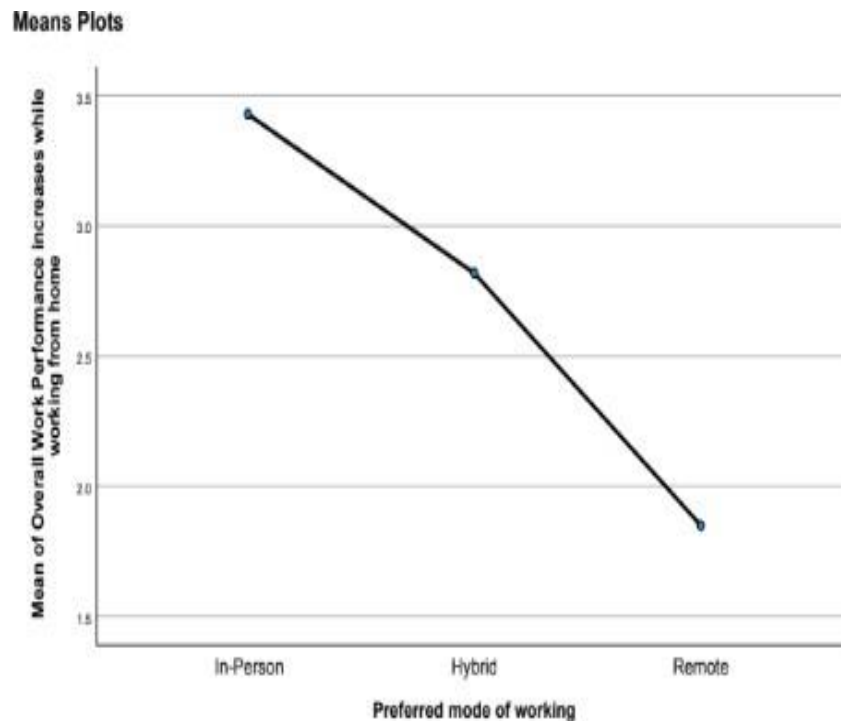


Fig 27: Mean of performance with Work from home vs Preferred mode of working

### Result of Analysis:

The p-value of the one-way ANOVA analysis is less than 0.05 which suggests we can reject the null hypothesis and conclude that there is a statistically significant difference between work categories. We further performed the post doc analysis and found that the different group combinations are also statistically significant having  $p < 0.05$ .

Also, looking at the means plot of work performance vs preferred mode of working it is apparent that in-person employees saw the greatest increase in work performance while working from home.

### Actual Mode of Working vs Work Performance increase while working from home

We reject the null hypothesis and conclude that there is a statistically significant difference in work categories. The post doc analysis suggests that the different group combinations are also statistically significant having  $p < 0.05$ .

The means plot suggests that remote employees feel the overall increase in work performance is not increased much while working from home. Opposite to which, the in-person employees feel that the performance is increased while working from home.

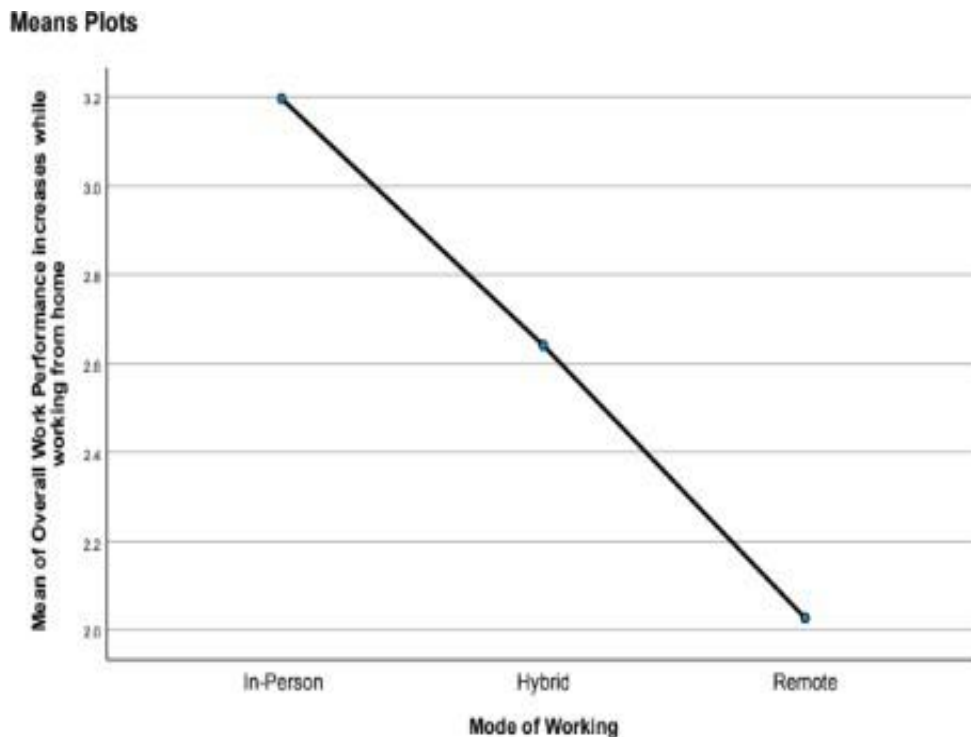


Fig 27: Mean of performance with Work from home vs Mode of working

**Explanation:** The p-value of this analysis was also less than 0.05 thus suggesting that there is a statistically significant difference in work categories.

The post doc analysis suggests that the different group combinations are also statistically

significant having  $p < 0.05$  for all combinations.

Now looking at the means plot, it suggests that employees who are already remote feel the overall increase in work performance is not increased much while working from home. Opposite to which, the in person employees feel that the performance is increased while working from home which gives us the idea that the companies should provide employees some flexibility to Work From Home as there is a performance increase.

## VIII. Discussion

Based on the above analysis, we found that our Null hypothesis **Employee's personal factors do not affect employee's on-site performance and/or remote performance.**

The above analysis was done on a very limited dataset and most people from the tech industry. This study can be taken forward and analyzed based on segment or industry specific.

The results from our data suggest that human personal factors do not affect overall work performance. What then affects employee performance? We can speculate that a person's perception of work performance may play a role in data, which in turn may play a role in how they may actually perform at work.

For example, if one of our surveyed participants perceived that they performed **well** at work, and their mode of work was in-person, they were 28 years old, married, and had 5 years of work experience. Do their personal factors influence their work performance, or their perceptions of their factors affect their work performance? The only way to know for sure is to further question their history, and perhaps follow their work performance over a longer period and periodically survey them. In addition to following this



participant, question a larger sample of similar participants with similar demographics, and background to understand if it is truly the factors that affect the work performance or the individual perceiving their factors affecting their work performance.

Studies that are based from self-reporting questionnaires often are subjective and offer insight into the persona of the subject and not of the factual information from an blind study that reports data from the manager's POV and personal data facts of the employee. In an article in SHRM titled, *Manager, Employee Perceptions of Performance Differ* (2009, Hastings), it states that employees tend to rate themselves higher than employers would rate them 50% of the time.

The article includes an excerpt from the author of, *Forced Ranking: Making Performance Management Work* (Grote, HBSP, 2009) which states that ..*“Research consistently demonstrates that individuals are notoriously inaccurate in assessing their own performance, and the poorer the performer, the higher (and more inaccurate) the self-assessment,” Grote says. “ ‘Know yourself’ may be good philosophical advice, but in assessing how good a job you’ve done, your boss knows better than you do.”* This suggests that employees rate themselves depending on how they perceive themselves and if this is the case, depending on how an individual sees themselves, will ultimately affect their perception of their work performance.

This also would suggest that if one's personal factors vary from age, marital status, mode of work, and/or years of experience, so may their perception be dependent or independent of these factors. Overall, our case study does prove that the personal factors that are represented in our study do not affect employee work performance.

## IX. Conclusion

Based on the analysis done, only Gender seems to have a relationship with the Work Performance while working remotely. Other factors like Age, Experience and Marital Status do not seem to have any relationship with the Work performance. Another relationship that was found was with Mode of working and Preferred mode of working in correlation with Work performance while working remotely/on-site.

These results may conclude that personal factors do not necessarily affect the performance of either mode of work. This does preclude more future research in mode of work versus location of remote or in-person work among home locations worldwide.

## X. References

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