

Comparison of Design optimization using Genetic Algorithm approach and DOE approach

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Abstract: The aim of this paper is to compare the Genetic Algorithm and DOE approach of design of compressor bearing. In the GA approach an objective function is formed which is defined as sum of coefficient of friction, frictional power loss, maximum temperature rise of the lubricant oil, oil flow rate and manufacturing cost with design variables as length of bearing and bearing pressure and bearing modulus as design constraint. In DOE approach the three input parameters taken are absolute viscosity (Z) of the lubricant, speed of journal (N) and maximum allowable pressure. The output parameter is coefficient of friction which has to be minimized. Taguchi L9 array is used to solve the problem in which set of nine input combinations of the three input. In Taguchi method there are three input parameters and nine input combinations in form of L9 array and the optimized result is obtained with nine experiments instead of 27 thereby saving a lot of time and money.

Index Terms- mutation; crossover; objective function; array; regression

1. INTRODUCTION

Genetic Algorithm are set of global search and optimization methods that is fast gaining popularity in solving complex engineering optimization problems with large search space. G.A is method of moving from one population to a new population of chromosomes by using natural selection together with the genetic search process of cross over and mutation. GA works on principle of survival of fittest and the central theme of research on genetic algorithm has been robustness, the balance between efficiency and efficacy necessary for the survival in many different environments.

Tools of genetic Algorithm:- Genetic algorithm (GA) operates with the help of three operators namely:-

1. *Reproduction*
2. *Mutation*
3. *Cross Over*

1. *Reproduction*:- This is the first operator which is applied to the existing population to create new and better offsprings. The offsprings whose probability of selection is less is rejected and the offsprings whose probability of selection is high are selected and carried forward. The probability of selection of particular string is proportional to its own fitness.

2. *Mutation*:- Mutation is aimed to maintain diversity in population and it creates a new solution in neighborhood of current solution by introduction small change in some aspect of current solution, for example in a binary coded digit one bit may be altered from 0 to 1 or from 1 to 0 and thus creating new solution

Bit Mutated	New Bit
110110	110010

3. *Crossover*:- In crossover process the crossing site is randomly chosen along the string length and all the bits to the right side of this crossing site are exchanged between two parent strings as;

0 0 0 0 0	0 0 0 1 1
1 1 1 1 1	1 1 1 0 0

In Taguchi method there are three input parameters and nine input combinations in form of L9 array and the optimized result is obtained with nine experiments instead of 27 thereby saving a lot of time and money.

2. PROBLEM FORMULATION IN GA

In problem formulation an objective function has to minimize which is defined as sum of:-

- a) Coefficient of friction
- b) Frictional power loss
- c) Maximum oil film temperature rise
- d) Supply oil quantity
- e) Manufacturing cost

The design variables are taken as the length of bearing (l) and bearing pressure (p) and the design constraint is bearing modulus given by ZN/p

Defining the design constraint:- The variation between the coefficient of friction and bearing modulus is shown in Fig1

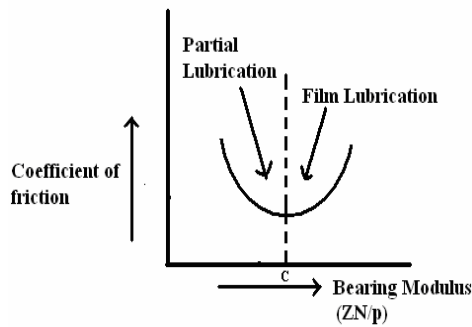


Fig 1. Variation of bearing modulus with coefficient of friction

The value of bearing modulus at which coefficient of friction is minimum is denoted by C. For bearing to operate in film lubrication region the value of bearing modulus should be greater than C. For safe design, $ZN/p \geq 3C$.

If the value of bearing modulus is less than critical value then bearing will operate in partial lubrication conditions and there will be wear and tear of the bearing and the performance of the bearing will drop and its life will decrease.

3. DEFINING THE PROBLEM IN GA

- i) Coefficient of friction $= \pi^2/30 \times 10^6 (ZN/p)r/c$
 - ii) Frictional torque loss $= \pi^2 Z d^3 \ln/C_d N-m$
 - iii) Heat Generated $= f F v$ watt
 - iv) Heat dissipated $= K_d l d (t_B - t_A)$ watt
 $t_B - t_A = 1/2(t_o - t_A)$
 - v) Supply oil quantity $= 3\pi C^3 r / 0.1 \times 10^9 z l p_s \times 10^6$ mm/s
 - vi) Manufacturing Cost $= Rate \times \rho \pi / 4 d^2 l$ Rs
- The objective function is to minimize i), ii), iii), v) and vi) and maximize iv) or to minimize reciprocal of iv). The objective function to be minimized is given by:-
 $f(l,p) = \pi^2/30 \times 10^6 (ZN/p)r/c + \pi^2 Z d^3 \ln/C_d + f F v + 1/K_d l d (t_B - t_A) + 3\pi C^3 r / 0.1 \times 10^9 z l p_s \times 10^6 + Rate \times \rho \pi / 4 d^2 l$...Eqn I where l and p are design variables and bearing modulus ZN/p is design constraint

4. DESIGN EXAMPLE

Consider the following design parameters of sample bearings set used for compressors:

Table 1 Design Parameters

S. No	Bearing Parameters	Value
1	Load, F	30 kN
2	Absolute Viscosity, Z	.018 Ns/m ²
3	Speed, N	900 rpm
4	Diameter of Journal, d	0.15m

5	Temperature of oil film, t _o	55°C
6	Supply Pressure, p _s	1MPa

The clearance ratio c/r for compressor bearing is 0.0013. For the given set of parameters the objective functions given by (I) can be written as;

$f(l,p) = 46.091 l + 868.050/p + 0.00153/l$...Eqn II

The objective function to be minimized is given by Eqn.(II)

Design Variables

- .15 m < l < .30 (for compressors l/d vary from 1 to 2)
- $.7 \times 10^6 \text{ N/m}^2 < p < 1.4 \times 10^6 \text{ N/m}^2$ (from design data book)

Design Constraint

- $ZN/p > c$
- $0.18 \times 900/p > 9.99$
- For compressor bearing the value of C from design data book is 9.99
- $1.62/p > 9.99$ or $1 - 1.62/9.99p < 0$

5. OPTIMIZED RESULT USING G.A

A program is developed in C language after making some modification according to our design problem in standard G.A. code available for various references. Once input data mentioned in Table 2 is given, the output can be obtained from 3 files i.e. result out, plot out and report out after running the program.

Table 2: G.A. input data

1	Population Size	20
2	Total no of generations	20
3	Crossover probability	0.8
4	Mutation probability	0.1
5	Total string length	40
6	No of binary coded variables	2
7	Lower and Upper bounds of variables	0.15 < x1 < 0.30 700000 < x2 < 400000

1. The best ever fitness in run 1 comes out to be 6.941560 from generation No. 19 and the best ever fitness in run 2 comes out to be 6.924739 from generation No. 19.
2. In run 1 corresponding to the best ever fitness of 6.941560 from generation No. 19 the value of the variables x [1] and x [2] are x [1] = .150371, x [2] = 1387641.227380. In run 2 corresponding to the best ever fitness of 6.924739 from generation No. 19 the values of the variables x [1] = .15005 and x [2] = 1344102.806189.

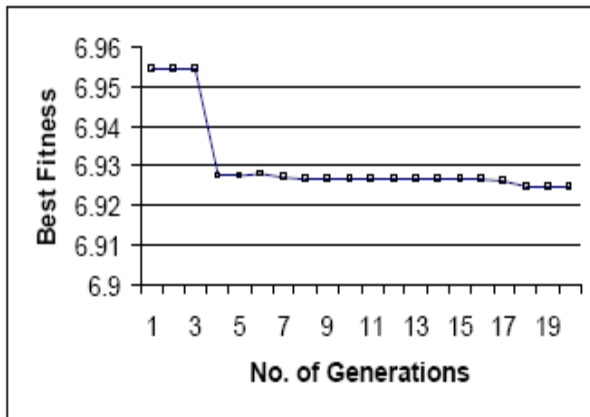


Fig. 2. Variation of best fitness with number of generations(Run2)

3. The variation of objective function with the no. of generations is shown in Fig 2. It can be seen that as G.A get started and run continuously an improvement is found in the best fitness and towards the end of run a form of convergence is observed.

4. Using G.A. the optimized value of design variables are

$$l = .150005 \text{ mts}$$

$$p = 1344102.8061 \text{ N/m}^2$$

The optimized value of objective function using G.A. is 6.9247 i.e. $f(l, p) = 6.9247$

Conventional design calculations

Taking $l/d=1.5, l=0.225\text{m}$

$$p = F/l d = 30 \times 10^3 / .225 \times 1.5 = 88888888.88 \text{ N/m}^2$$

$$f(l,p) = 10.378 \text{ (from equation II)}$$

The value of objective function using conventional method = 10.378

Table 3. Conventional Method Vs GA

S No.	Conventional Method	G.A
1	Frictional Torque =10.366 N-m	Frictional Torque =10.366 N-m
2	Coefficient of friction=0.0046	Coefficient of friction=0.0030
3	Volume of metal=0.00396m ³	Volume of metal=0.00264m ³
4	Flow rate=0.0016 mm ³ /s	Flow rate=0.0024 mm ³ /s
5	Temperature rise=785.19/C, where C=m C _p	Temperature rise=518.23/C, where C=m C _p

6. METHODOLOGY IN DOE

Experimental design strategy, using Taguchi orthogonal arrays concept as used. The following L-9 orthogonal array was applies

Table 4. L-9 Orthogonal array with actual values

Absolute Viscosity(Z) kg/m-s	Speed (rpm)	Max. Allowable pressure (N/mm ²)	Coefficient of friction μ
0.017	900	0.7	0.007548352
0.017	1100	1	0.006746923
0.017	1500	1.3	0.00697929
0.06	900	1	0.015707692
0.06	1100	1.3	0.014887574
0.06	1500	0.7	0.034637363
0.12	900	1.3	0.023088757
0.12	1100	0.7	0.035507692
0.12	1500	1	0.035507692

Observations in Taguchi Analysis: Coefficient of friction μ versus Absolute Viscosity, Speed in rpm, Max. Allowable pressure (N/mm²)

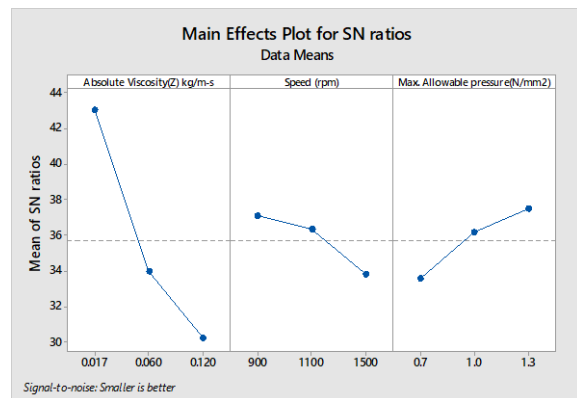


Fig 3 Main effects plot for S/N Ratio (μ)

The above SN ratio graph was made using 3 variables i.e. Absolute Viscosity, Speed in rpm, maximum allowable pressure (N/mm²). As observed from graph, it is clear that at 0.017 absolute viscosity (Z) kg/m-s, 900 speed in rpm and 1.3 max. allowable pressure (N/mm²) gives the best output in terms of coefficient of friction μ ie. it will be minimum.

Table 5 General linear Model (ANOVA) for μ

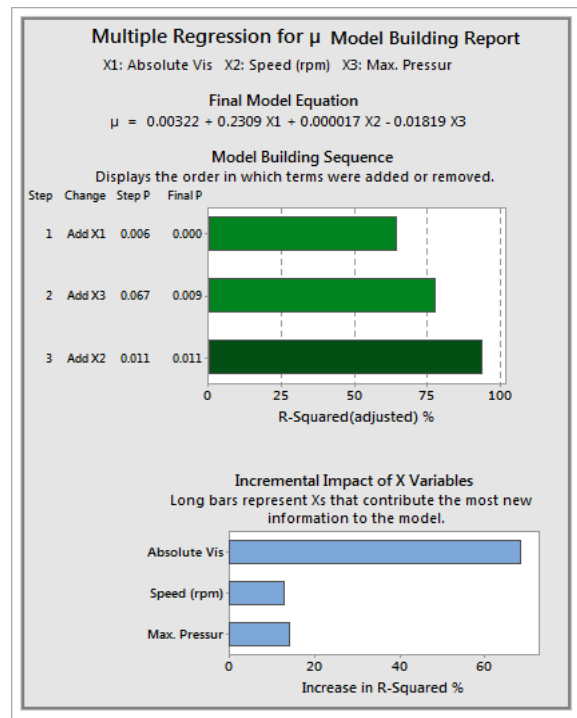
Source	DF	Seq SS	Adj SS	Adj MS	F	P	Contribution
Absolute Viscosity (kg/m-s)	2	258.340	258.340	129.170	155.42	0.006	85.57%
Speed (rpm)	2	18.001	18.001	9.000	10.83	0.085	5.96%
Allowable pressure (N/mm ²)	2	23.884	23.884	11.942	14.37	0.065	7.91%
Residual Error	2	1.662	1.662	0.831			0.55%
Total	8	301.888					

From the ANOVA model for the above experimentation, the calculations are done at 95% confidence level. In an analysis of variance table, the P value determines the most significant factor. The factor whose P value is less than 0.05 will be most effective factor. The ANOVA table clearly indicates that speed in rpm and maximum allowable pressure (N/mm²) are not significant parameter for optimizing the coefficient of friction μ . Absolute Viscosity (kg/m-s), is the significant term that influence the model to a great extent. Absolute Viscosity (kg/m-s) has the greatest effect on optimizing coefficient of friction μ and is followed by maximum allowable pressure (N/mm²) and speed in rpm

6.1 General Regression equation for Coefficient of friction μ , Absolute Viscosity, Speed in rpm, maximum allowable pressure (N/mm²).

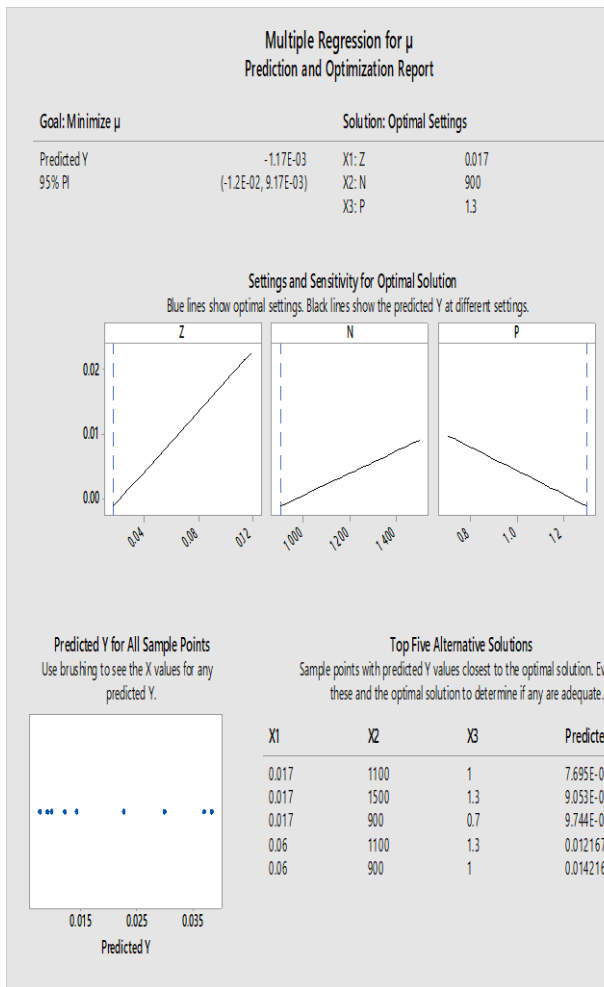
The following equation has been formed with the help of software MINITAB version 17:

Coefficient of friction = 0.00322 + 0.2309 Absolute Viscosity + 0.000017 Speed - 0.01819 maximum allowable pressure.



6.2 Optimized parameters combination

As **Coefficient of friction μ** is the “smaller is better” type quality type characteristic, from the figure 3 it can be seen that the third level of maximum allowable pressure, first level of speed and first level of absolute viscosity results in maximum value of coefficient of friction μ .



The configuration of these contours allows map readers to infer relative gradient of a parameter and estimate that parameter at specific places.

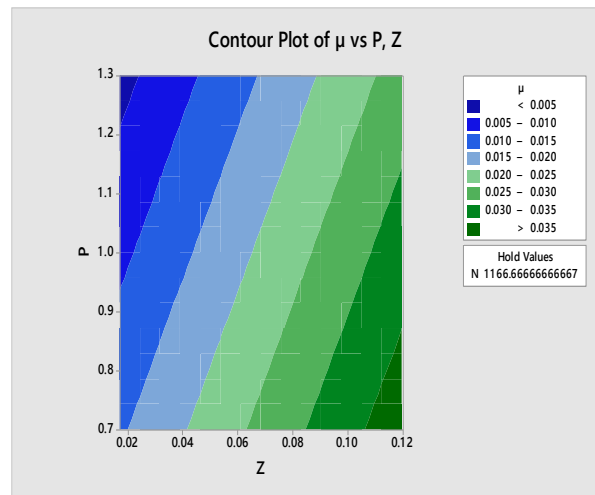
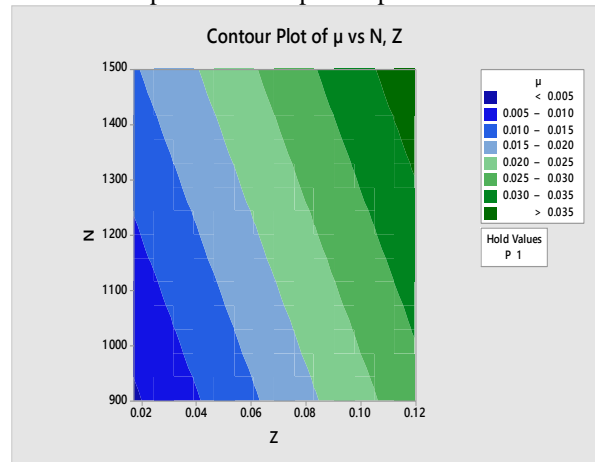
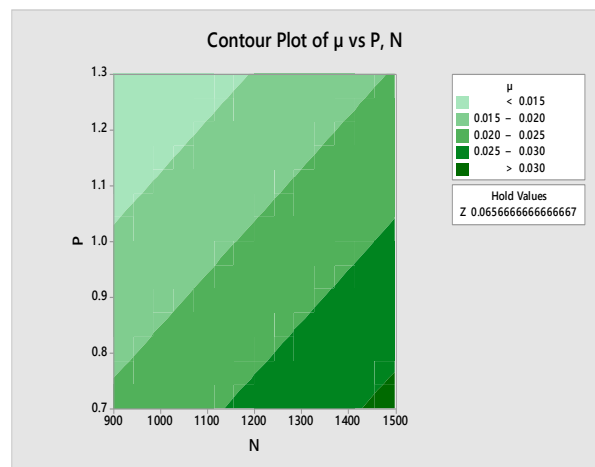


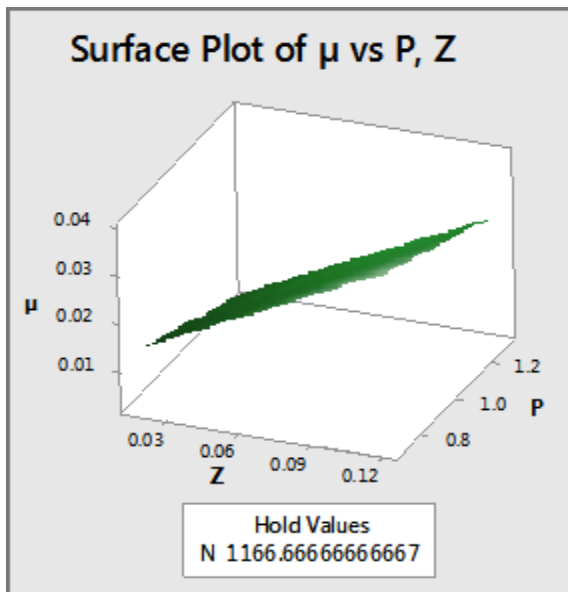
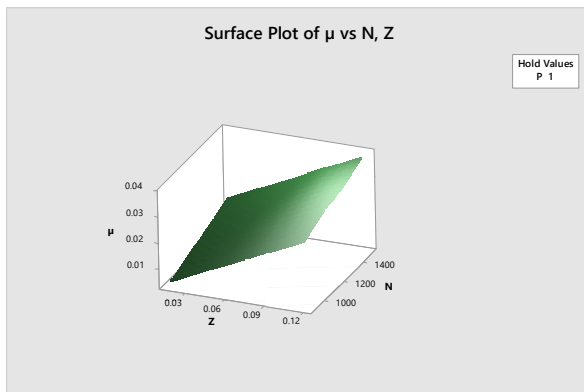
Table 6 Optimal value of μ .(optimization report)

Sr. no.	Absolute Viscosity kg/m-s	Speed rpm	Max. Allowable pressure (N/mm ²)	Coefficient of friction μ
1	0.017	900	1.3	0.00117

6.3 Contour plots for coefficient of friction

A contour plot is a graphical technique for representing a 3-dimensional surface by plotting constant z slices, called contours, on a 2-dimensional format. That is, given a value for z, lines are drawn for connecting the (x,y) coordinates where that z value occurs. In cartography, a contour line often just called a "contour" joins points of equal elevation (height) above a given level, such as mean sea level.





7. CONCLUSION

The optimized value of length of bearing and bearing pressure are obtained through genetic algorithm and also by conventional method. The different parameters of the objective function are calculated by both these methods and the comparison is made between the two different approaches of design and the result are tabulated in Table 5, the following conclusions can be drawn from the above analysis:-

- a) Reduction in frictional torque using G.A.
 $10.366 - 6.911 / 10.366 = 33.3\%$
- b) Reduction in coefficient of friction using G.A.
 $0.046 - .0030 / .0046 = 34.7\%$
- c) Reduction in manufacturing cost using G.A.
 $0.039 - .0026 / .0039 = 33.3\%$
- d) Reduction in temperature rise using G.A.
 $785.19 - 518.23 / 785.19 = 33.9\%$
- e) Increase in flow rate using G.A.
 $0.024 - .0016 / .0024 = 33.3\%$

Overall reduction in objective function using G.A

$$10.378 - 6.9247 / 10.378 = 33.27\%$$

Hence it is concluded that there is improvement in the characteristics of the compressor bearing using

Genetic Algorithm approach of design by approximately 33%

In DOE approach the optimized value of coefficient of friction comes out to be at absolute viscosity of 0.017 kg/m-s, speed of 900 rpm and allowable pressure of 1.3 N/mm². Further from Table 5 it is evident that maximum contribution towards achieving the optimized output is of absolute viscosity (Z) which is 85.57%. The contribution of speed (N) and maximum allowable pressure is 5.96 percent and 7.91 percent respectively. The application of Taguchi L9 array provides the optimized result with 95 percent confidence level and by using only 9 input values rather than conducting 27 experiments. Hence this technique of optimizing is accurate, fast and reliable and can be carried out conveniently with less effort and resources.

8. FUTURE SCOPE

The study presented in the paper is limited to hydrodynamic journal bearing of compressor with absolute viscosity, speed of journal and allowable pressure as design inputs. It can be extended to include radial clearance as design variable. Further Taguchi technique can be used to optimize heat generation and dissipation in bearing, temperature rise in bearing, manufacturing cost, oil leakage flow rate, whirl onset velocity of shaft and shaft twist as design input variables which are to be optimized. The present study can be extended to improve the characteristics of elliptical journal bearings, roller bearings and thrust bearings. The bearings for pumps, turbines, generators, motors, railway, cars, gyroscope, gas and oil engines, machine tools, rolling mills etc can also be optimized.

REFERENCES

- [1] Genetic Algorithm in search and optimization by D.E Goldberg
- [2] Machine design by PC Sharma and DK Aggarwal
- [3] Machine design by Sadhu Singh
- [4] Optimum design of hydrodynamic journal bearing by A Seireg and H Ezzat
- [5] Improvement of operating characteristics of high speed journal bearings by optimum design, H. Hashimoto and K. Matsumoto
- [6] A comparative analysis of selection scheme used in genetic algorithm by K. Deb
- [7] Taguchi's quality engineering handbook by Dr. Genichi Taguchi, Dr. Subir Chowdhury, Yun Wu
- [8] Taguchi, G. 1976, 1977. *Experimental Designs*. Vol. 1 and 2. Tokyo: Maruzen Publishing Company.
- [9] Taguchi, G. 1974. "A New Statistical Analysis Method for Clinical Data, the Accumulation Analysis, in Contrast with the Chisquare Test." *Saishain-igaku* 29: 806-813.

- [10].Evaluation of Mechanical behavior of Al-alloy/
SiC metal matrix composites with respect to their
constituents using Taguchi techniques, A.
Chennakesava Reddy, JNTU, AP, India.