PREDICTION OF COMPRESSIVE STRENGTH USING GENETIC PROGRAMMING INVOLVING NDT RESULTS

A thesis submitted in partial fulfillment of the requirements for the degree of

Bachelor of Technology

In

Civil Engineering

By

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May 2015

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CERTIFICATE

This is to certify that this report entitled, "**PREDICTION OF COMPRESSIVE STRENGTH USING GENETIC PROGRAMMING INVOLVING NDT RESULTS**" submitted by **Prashant Kumar (111CE0462)** in partial fulfillment of the requirement for the award of Bachelor of Technology Degree in Civil Engineering at National Institute of Technology, Rourkela is an authentic work carried out by him under my supervision.

To the best of my knowledge, the matter embodied in this report has not been submitted to any other university/institute for the award of any degree or diploma.

Date :11/05/2015

Prof. Asha Patel Department of Civil Engineering NIT ROURKELA (Research Guide)

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PRASHANT KUMAR

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ABSTRACT

Compressive strength of concrete is major parameter to assess the overall quality of concrete as other mechanical prosperities are directly related to the compressive strength. It can be determined using the destructive (DT) and non-destructive testing (NDT) methods. The destructive testing method is carried out by crushing the specimen to failure while the non-destructive is carried out without destroying the concrete specimen. The destructive method is time taking process and required equipment's and power. Whereas the NDT methods like the rebound (Schmitz) hammer and Ultrasonic Pulse velocity (UPV) are most popular because they are handy, quicker and easy to use. Though the NDT methods are much quicker; their values are more of an approximation than exact compressive strength values. They are also machine specific, hence a calibration curve is provided by supplier which may not be reliable. The Indian code recommends about 25% variation in results, which is very high. The newly developed soft computing techniques like ANN, Fuzzy logic, Genetic programming etc. may be used to prepare a better numerical model correlating DT and NDT results.

Hence the aim of the present study is to propose a model correlating the compressive strength obtained from destructive and non-destructive methods by using Genetic Programming. The whole work involves casting of 100 cubes of 150mm size belonging to of different grades of concrete. They were tested under compression following DT and NDT methods. These data were used for modelling ie.(70% for training and 30% for testing) in GP. The modelling is done two ways, first by using variables as weight and Rebound values and secondly by using weight, rebound values and UPV values. The models obtained were found to be in good agreement with actual values imparting 6.744 % and 7.4434% error respectively. To further check the efficiency of predictions Regression analysis were conducted for actual and predicted values and found to be in good agreement.

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CHAPTER ~ 1

INTRODUCTION

1.1 OBJECTIVE

The objective of the present work was to propose a model correlating the compressive strength obtained from destructive and non-destructive methods by using Genetic Programming. The whole work involves casting of 100 cubes of 150mm size belonging to of different grades of concrete. They were tested under compression following DT and NDT methods. These data were used for modelling in GP. 60 % data were for training and 30% for testing .The modelling is done in two steps, first by taking variables as weight and Rebound values and secondly by taking weight, rebound values and UPV values.

1.2 INTRODUCTION

WHAT IS NDT ..?

Nondestructive testing (NDT) is a method to find indirectly the different parameters of hardened concrete like strength, durability and other elastic properties without loading the specimen till failure.

It is noted that the values obtained from NDT method are not so accurate. The error percentage are generally (30 to 40) % .Therefore these values need to be correlated with actual values obtained from destructive method by using compressive testing machine.

Therefore the main objective of this project is to develop an empirical relation between the values obtained by DT and NDT methods by the means of empirical equation developed by using GP. The variable involved in modelling are results obtained from NDT equipment's and weight of samples.

Instruments used are

1. REBOUND HAMMER

2. ULTRASONIC PULSE VELOCITY TESTER

(1) **REBOUND HAMMER**

<u>DESCRIPTION</u>: - Ernst Schmidt, a Swiss engineer, developed the modern rebound hammer in 1948. It is one of the most famous instrument for the Non-destructive testing of concrete specimen. Its popularity is due to its simplicity in using and also due to its low cost.

PRINCIPLE:-

It basically comprises of spring control hammer that slides on a plunger within the tubular housing. When the rebound hammer is pressed against the concrete specimen which is to be checked, the mass rebound from the plunger. This amount of rebound is measured which gives "REBOUND NUMBER". This rebound hammer is basically measured on a scale which is between 10 to 100. It basically measures the surface hardness of concrete. It is also known as impact hammer.

It depends upon the surface hardness as stated earlier. For any concrete specimen it shows different value of rebound number at different age of concrete. At early stage when concrete is weak and soft, it shows lesser value than when the concrete becomes strong and hard in later stage.

Factors on which rebound hammer depends:-

- 1. Hardness of surface
- 2. Size and shape of concrete specimen
- 3. Age of concrete
- 4. Presence of moisture in concrete
- 5. Carbonation
- 6. Types of cement and types of admixtures used
- 7. Location of reinforcement.
- 8. Type of coarse aggregate.

Since rebound hammer value depends upon so many factor, it is very necessary to use it as per standard procedure as given below.

1. The minimum area which is tested must be more than or equal to 150 mm.

2. The specimen should be properly fixed during testing.

3. The surface of specimen should be flat and no loose mortar should be present as it would affect the rebound value.

- 4. The surface to be tested must be completely dry that is free from moisture.
- 5. Frozen concrete should be avoided from testing.

6. The rebound hammer must be kept at right angle to the specimen as even a small inclination may vary the results considerably.

7. The cover over the reinforcement in the specimen should be more than 20 mm.

8. At least 10 reading must be taken for each specimen and the impact point should be at least 1 inch apart.

9. The average value of all the readings gives the rebound number for that specimen.



FIG-1.1 REBOND HAMMER

(2)ULTRASONIC PULSE VELOCITY TESTER

Ultrasonic pulse velocity tester is a type of Non-destructive testing (NDT) equipment, which is used to determine the quality and homogeneity of concrete. It determines the quality and homogeneity of concrete by detecting cracks, flaws etc., within the specimen. From this equipment two parameters ultrasonic velocity and time of travel of ultrasonic waves through the specimen are determined.

PRINCIPLE:-

It consists of generation of ultrasonic pulse produced by an electro-acoustical transducer, held in contact with one surface of the concrete member under test and receiving the same by a similar transducer in contact with the surface at the other end. With the path length (L) and time of travel (T), the velocity of pulse (V) is measured (V=L/T).higher the velocity of pulse better is the quality of concrete in terms of quality, homogeneity and density.

PROCEDURE:-

1. First the specimen to be tested is cleaned properly to make it free from dust or other impurities.

2. Then grease is applied to the two opposite faces of cube and transducers are pressed hard on the surface of greased material.

3. Transducers are held fixed during measurement as even a slight movement could vary the results.

4. Transducers are held till the reading on the machine becomes constant.

5. Two reading i.e. velocity (m/s) and time (microsecond) is noted down.

Pulse velocity is affected by:-

1. Path length

2. Lateral dimension of specimen tested

3. Presence of reinforcing steel

4. Presence of moisture in concrete.

Pulse velocity is not affected by path length unless the path length is less than 100 mm when 20mm aggregate is used and 150mm when 40mm aggregate is used In reinforcing bars the velocity of wave is more than in concrete. Therefore presence of bars can lead to wrong values. Presence of moisture leads to variation in pulse velocity, Higher the moisture content more will be the velocity.

Table: 1 - General Guidelines for Concrete Quality based on UPV

PULSE VELOCITY	CONCRETE QUALITY
>4.0 km/s	Very good to excellent
3.5 – 4.0 km/s	Good to very good, slight porosity may exist
3.0 – 3.5 km/s	Satisfactory but loss of integrity is suspected
<3.0 km/s	Poor and los of integrity exist.



FIG-1.2 ULTRASONIC SONIC PULSE VELOCITY TESTER

1.3 GENETIC PROGRAMMING

Genetic programming is a model of programming which uses the ideas (and some of the terminology) of biological evolution to handle a complex problem. Genetic programming can be viewed as an extension of the *genetic algorithm*, a model for testing and selecting the best choice among a set of results, each represented by a string.

In this work Genetic Programming (GP) is used to predict an empirical model for the convoluted non-straight relation between the actual compressive strength obtained by compressive testing machine with the result obtained by NDT methods. It is a manifestation of artificial intelligence and thoughts, which is focused around the Darwinian hypothesis of evolution and genetics.

CHAPTER ~ 2

LITERATURE REVIEW

- Turgut.P (2004) has done the study on correlation between ultrasonic pulse velocity values and actual compressive strength. The data was obtained from many cores taken from different reinforced concrete structures having different ages and unknown ratios of concrete mixtures. The main motive of his work was to develop the formula which correlates between the actual data and UPV values without taking the mix ratio in consideration. He concluded that the value of UPV increases with increase in compressive strength of concrete. He also stated that ultrasonic test on the higher strength concrete is more reliable. Rebound values gives more precise and correct values as compared to UPV values under certain conditions. Also it is always advisable to go for combined results of both the NDT test as this gives more trustworthy results.
- Shariati M et al. (2011) paper gave a relation between the actual compressive strength of a structure in compression test with that of NDT (Non Destructive Test) values. The NDT test has been done to test the quality of concrete structure and the correlation is done using regression analysis method between test values and actual in situ value of compressive strength of structure. The members of structure which is tested id Beams, Column and Slabs. The values obtained from the crashing records of specimen is compared with the test values to examine the variation in both the results. The result finally shows that Rebound Hammer test is more efficient in predicting the result under certain condition. But the application of the combined results of both NDT test provide more reliable results.
- Sbartai Zoubir-mehdi (2012) presented a paper which deals with the strategy employed and the first results obtained from a comprehensive experimental database of NDT techniques. It also emphasizes how the variability of measurements can be taken into account and how statistical analyses can be used to evaluate the relevance of the available NDT techniques. He stated that the degree of complementarity between NDT techniques was quantified using Principal Component Analysis. Several combinations have been identified which appear to be very relevant, when porosity and water saturation have to be evaluated.
- Shankar Siddharth et al. (2010) had done the research which deals with the comparison of actual compressive strength of cubes with those of NDT values. The methodology used in this research work is laboratory works and experiments based. The research was done on various samples of concrete cubes and cylindrical cubes. They concluded that the results of NDT values should always be compared with the actual compressive strength and the best value should be taken as final estimate. And also the NDT test should always be performed with two NDT equipment and the best out of them should be taken as final value.

CHAPTER ~ 3

METHEDOLOGY

The steps followed were

- Mix Design of concrete of different grades ranging from M15 to M40 following .
- Casting of standard cubes of 150mm size for different grades of concrete.
- Testing of cubes after 7 days, 28 days,90 days by using NDT equipments following testing under compression testing machine till failure.
- The observed data i.e. rebound value, velocity, weight, actual compressive strength were used for the analysis in Matlab through its tool Genetic Programming.
- Through genetic programming the difference in NDT values and actual values are optimized to generate an empirical model which could correlate them.

CHAPTER ~ 4

EXPERIMENTAL PROGRAMME

4.1 METHODS FOLLOWED:-

- Firstly cube(150*150*150) of different proportions have been cast using Mix design(IS 10262-2009):-
- The cubes were cast for concrete of following proportions obtained from mix design. To get mixes of higher strength various proportions of cement is replaced by silica fume.
 - 1. 1:1.7:3.4
 - 2. 1:1.5:3
 - 3. 1:1.3:2.6
 - 4. 1:1.1:2.2
 - 5. 1:1:2
 - 6. 1:1.3:2.6 with 5% replacement of cement by silica fume.
 - 7. 1:1.1:2.2 with 5% replacement of cement by silica fume.
 - 8. 1:1:2 with 7% replacement of cement by silica fume.
 - 9. 1:1:2 with 10% replacement of cement by silica fume.
- The cubes were tested by using NDT equipments and Compressive testing machine. The observed values are given in table 4.1 to 4.9.

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.2	14.43	30	4321
2	8.12	14.8	32.2	4223
3	8.23	14.3	31.9	4312
4	8.28	14.67	30.1	4518
5	8.33	17.33	34.9	4425
6	8.29	15.11	32.6	4298
7	8.20	23.11	38	6024
8	8.23	26.67	39	5682
9	8.28	26.67	41.1	5792
10	8.22	21.78	41.2	5906

TABLE 4.1-MIX PROPORTION - 1:1.7:3.4

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.18	15.8	31.6	5432
2	8.32	16.1	35.5	5231
3	8.12	19.32	31.4	5432
4	8.21	30.22	40	5682
5	8.26	32	41.6	5792
6	8.19	29.33	37.5	6024
7	8.13	31.11	43.3	5906
8	8.19	32	39.8	6148
9	8.24	27.11	42.5	5792
10	8.20	30.67	40.3	5682
11	8.23	29.87	38.21	5790
12	8.21	28.33	39.77	5432

TABLE 4.2-MIX PROPORTION - 1:1.5:3

TABLE 4.3-MIX PROPORTION – 1:1.3:2.6

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.17	20.88	32.8	4360
2	8.14	18.67	33.6	4237
3	8.11	20.44	33.8	4121
4	8.106	26.22	35.8	4598
5	8.124	24.44	39	4559
6	8.128	25.33	36	4491
7	8.178	32	37.33	4491
8	8.026	29.77	38.20	4298
9	8.122	31.11	36.90	4425
10	8.114	30.22	37.80	4360
11	8.124	24.44	39	4559

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.01	21.78	32.7	4298
2	8.22	22.22	34	4360
3	8.21	22.22	37.9	4178
4	8.126	28.44	41.7	4559
5	8.20	30.67	36.7	4425
6	8.262	28.44	38.5	4360
7	8.246	32.44	41.4	4464
8	8.242	33.03	41.8	4335
9	8.186	31.78	39.4	4298
10	8.298	30.67	40.7	3580
11	8.262	28.44	38.5	4360

TABLE 4.4-MIX PROPORTION – 1:1.1:2.2

TABLE 4.5-MIX PROPORTION - 1:1.3:2.6(HSC SILICA 5%)

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	7.48	28.89	42.5	4298
2	7.6	32	40.1	4360
3	7.66	32	40.1	4360
4	7.86	26.22	39.2	4178
5	7.84	32.88	39.3	4178
6	7.64	27.55	40.1	4298
7	7.86	29.33	40	4360
8	7.94	27.11	41.7	4386
9	7.86	26.22	39.2	4178
10	7.88	27.31	40.32	4352
11	7.83	28.36	38.8	4288

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.14	34.22	37.5	4630
2	8.22	38.22	39.9	4559
3	8.14	35.55	38.7	4464
4	8.36	36.22	40.3	4559
5	8.26	34.66	39.3	4587
6	8.28	36.88	38.8	4630
7	8.28	37.33	42.5	4559
8	8.29	36.2	41.7	4386
9	8.36	36.22	40.3	4559
10	8.31	37.21	42.36	4667
11	8.28	36.88	38.8	4630

TABLE 4.6-MIX PROPORTION – 1:1.1:2.2(HSC SILICA 5%)

TABLE 4.7-MIX PROPORTION – 1:1:2(HSC SILICA 5%)

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.28	35.55	41.6	4274
2	8.26	35.55	40.8	4491
3	8.24	34.22	42.5	4425
4	8.22	40.44	40.3	4386
5	8.32	36.44	42	4261
6	8.26	33.77	41	4335
7	8.36	36.44	41	4312
8	8.16	39.55	40.1	4518
9	8.26	33.77	41	4335
10	8.24	34.22	42.5	4425
11	8.27	33.78	39.56	4478

SL NO.	WEIGHT(KG)	WEIGHT(KG) ACTUAL REBOUND			
		Fcu(N/mm ²)	HAMMER	(m/s)	
1	8.13	38.6	35.6	4630	
2	8.28	38.6	35.78	4630	
3	8.27 35.11		36	4464	
4	8.164	32.88	36.8	4298	
5	8.201	31.11	36.7	4360	
6	8.212	30.22	32.7	4237	
7	8.24	41.77	34	4491	
8	8.242	42.22	37.9	4518	
9	8.18	41.77	41.7	4399	
10	8.29	39.7	36.7	4580	
11	8.24	41.77	34	4491	

TABLE 4.8-MIX PROPORTION - 1:1:2

TABLE 4.9-MIX PROPORTION – 1:1:2(HSC 10% SILICA)

SL NO.	WEIGHT(KG)	ACTUAL Fcu(N/mm²)	REBOUND HAMMER	VELOCITY (m/s)
1	8.28	47.55	45.7	4559
2	8.214	47.55	44	4587
3	8.239	46.66	47.9	4601
4	8.27	40.44	41.7	4360
5	8.22	40.88	46.7	4559
6	8.281	38.92	48.5	4532
7	8.26	39.11	41.4	4630
8	8.263	40	41.8	4360
9	8.25	35.55	39.4	4491
10	8.258	39.7	40.7	4580
11	8.213	39.11	41.4	4630

4.2 GENETIC PROGRAMMING:-

GP is a domaininant autonomous, problem-solution approach through which computer programs are generated to find solutions for the problems. The technique is based on the Darwinian hypothesis of 'survival of the fittest'. Every result predicted by GP is compiled from two sets of primary nodes; terminals and functions. The terminal set holds nodes that provide a framework to the GP system while the function set contains nodes that processes values already inside the system. There are three major evolutionary operators within a GP framework:

REPRODUCTION: it chooses an individual from the initial population to be replicated exactly into the subsequent generation. In reproduction a strategy is made to kill the underperformed program. There are few methods of selection from which individual is duplicated which includes fitness measure, selection, rank selection and tournament selection.

CROSSOVER: it is a recombination technique, where two parent results are picked and parts of their sub-tree are exchanged in light of fact that each function holds the property 'closure' (each tree member can transform all possible argument values), every crossover operation ought to bring a legal structure. It follows the following principle:

- 1. Two trees are selected from the population lot.
- 2. One node is randomly selected from each trees
- 3. Selected nodes sub trees are exchanged to bring two children of new population

MUTATION: it is responsible for irregular changes in a tree before it is brought into the next population. Dissimilar to crossover, it is a biogenetic and works on one single individual. Throughout mutation process either all functions or terminals are separated underneath an arbitrarily determined node and a new limb is randomly generated or a single node is exchanged with each other.

Perspective to portray GP as far as the structures that experiences adaptation are

- \Box Initial structure generation
- \Box Fitness measure test, which assess the structure
- \Box Operation which change the structure
- \Box The state (memory) of the framework at each stage
- \Box The system for terminating the process
- \Box The system for designating an output, and the parameters that control the process



Following above principle, an empirical model was generated which selected the most fittest chromosomes to obtain the optimized result.it used about 60% of test data for training and rest 40% data was used for testing.

The modelling is done in two sets

- 1. Two variables weight and rebound values were involved in modelling.
- 2. Three variables weight, rebound values and UPV values were involved in modelling

CHAPTER ~ 5

MODELLING USING GENETIC PROGRAMMING (GP)

5.1 MATLAB MODEL:-

Genetic programming, a tool in Matlab was used for correlating the values of actual compressive strength using destructive test with the NDT values obtained by rebound hammer and ultrasonic pulse velocity tester. Here the difference in values obtained using both DT and NDT results were optimized and a general formula was obtained to relate both the values so that the difference in both the value can be minimized. The following steps were followed in Matlab :-

PROCEDURAL STEPS FOR MODELLING 5.2

5.2.1 MODELLING FOR REBOUND HAMMER DATA-

In modelling variables taken were weight and rebound hammer value. The value of rebound hammer were found to be about 30% more than actual compressive strength.

The model selected is simple rational polynomial equation •

The step by step procedure for modeling of rebound hammer test STEP 1- The main program recalling the data from table 4.1 to 4.8 for analysis and specifying

training data and test data.



STEP 2- Apps → Optimisation tool → Solver → Genetic Algorithm

It is optimizing the values of specified chromosomes as per the specified operators.

	Optimization Tool	
File Help		
Problem Setup and Results	Options	Quick Reference <<
Solver: ga - Genetic Algorithm	Generations: Use default: 100	Genetic Algorithm Solver
Problem Fitness function:	Time limit: O Use default: Inf	Click to expand the section below corresp
Constraints:	Fitness limit: O Use default: -Inf	Problem Setup and Results Problem
Linear nequances. As ba	Specify: Stall generations: O Use default: 50	Constraints
Bounds: Lower: Upper: U	Stall time limit: Use default: Inf	 Run solver and view results Options Specify options for the Genetic Algorithm
Run solver and view results Use random states from previous run	Function tolerance: Use default: 1e-6 Specify	 Population Fitness scaling
Current iteration: Clear Results	Nonlinear constraint tolerance: Use default: 1e-6 Specify:	Selection
100 miles	E Plot functions	Reproduction
	Plot interval: 1	Mutation
Final point:	Expectation Genealogy Range	Crossover
	Score diversity Scores Selection	Migration
	Stopping Max constraint	Constraint parameters
8	Custom function: Custom function	Hybrid function



STEP 3- fitness function \rightarrow @fitnessWRH \rightarrow No. of variables \rightarrow 8 \rightarrow start

Fittest value of chromosomes were obtained.

*	Optimization Tool	
File Help		
Problem Setup and Results	Options	Quick Reference <<
Solver: ga - Genetic Algorithm 🗸 🗸	Generations: Use default: 100	Genetic Algorithm Solver
Problem	○ Specify:	This tool corresponds to the ga function.
Fitness function: @fitnessWRH	Time limit: Use default: Inf	Click to expand the section below corresp
Number of variables: 8	O Specify:	
Constraints:	Fitness limit: Use default: -Inf	Problem Setup and Results Problem
Linear inequalities: A: b:	○ Specify:	
Linear equalities: Aeq: beq:	Stall generations: Use default: 50	Constraints
Bounds: Lower: Upper:	○ Specify:	Run solver and view results
Nonlinear constraint function:	Stall time limit:	Options
Integer variable indices:	Specify:	Specify options for the Genetic Algorithm
Run solver and view results	Function tolerance: Use default: 1e-6	Population
Use random states from previous run	Specify:	
Start Pause Stop	Nonlinear constraint tolerance: • Use default: 1e-6	Fitness scaling
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	Plot interval: 1	
×	Best fitness Best individual Distance	P Mutation
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1 2 3 4 5 6 7 8	Core diversity Scorer Selection	Migration
0.424 -0.129 0.77 0.997 0.376 0.202 -1.072 1.157	Score diversity Scores Selection	
	stopping max constraint	 Constraint parameters
2	Custom function:	Hybrid function
	- Output function	

<u>Fig 5.3</u>

STEP 4-File \rightarrow Export to workspace \rightarrow Export to a MATLAB structured named \rightarrow ok

A		Optimization	Tool		
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Constraints:		Fitness limit:	Use default: -Inf		Problem Setup and Results
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Linear equalities: Aeq: beq					Constraints
Bounds: Lower: Upper	*	Export To Worl	cspace 📃 💌		Run solver and view results
Nonlinear constraint function:	Export problem	and options to a MATLAB st	ructure named: optimproblem		
Integer variable indices:	Include info	rmation needed to resume this run			Options Specify options for the Genetic Algorit
Run solver and view results	Export options a	as a variable named:	options		Population
Use random states from previous run	 Export results to 	o a MATLAB structure name	di optimresults		
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1 2 3 4 5 6	7 8	Expectation	Genealogy Calastian		Migration
0.424 -0.129 0.77 0.997 0.376	0.202 -1.072 1.157	Changing Stanging			The second state of the balance
		stopping			 Constraint parameters
5		Custom function:			Hybrid function
	Loose .	E Output function		~ <)

<u>Fig 5.4</u>

STEP 5- Editor → testWRH.m

In this step the remaining data are checked following GP optimized model.

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<u>Fig 5.5</u>

STEP 6- Run

The testing data were checked and Root mean square error was found to be 6.744%



<u>Fig 5.6</u>

5.2.2 MODELLING FOR REBOUND HAMMER & ULTRASONIC PULSE VELOCITY

<u>DATA</u>-

STEP 1- Same procedure is followed here



STEP 2- Apps → Optimisation tool → Solver → Genetic Algorithm

File Help							
Problem Setup and Resul	lts				Options		
Solver an Genetic Ala	orithm			V	Population		
Decklare	onunn			•	Population type:	Double vector 🗸	
Fitness functions					Population size:	● Use default: 20	
Finess function:	entness					Specific	
Number of variables: 9						Specify:	
Constraints:					Creation function:	Constraint dependent V	
Linear inequalities:	A:		b:				
Linear equalities:	Aeq:		beq:		Initial population:	● Use default: []	
Bounds:	Lower:		Upper:			O Specify:	
Nonlinear constraint fur	nction:				Initial scores	Ura default: []	
Integer variable indices:					initial scores.		
integer variable indices.						O Specify:	
Run solver and view resul	lts				Initial range:	● Use default: [0;1]	
Use random states fro	rom prev	vious run				O Specify:	
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Start House		op			Calling (mating	Durch	
Current iteration:				Clear Results	Scaling function:	Kank V	
					Selection		
					Selection function	Stochastic uniform	
Final point:							
^							
					Reproduction		
<				>	Elite count:	• Use default: 2	
							1

<u>Fig 5.8</u>

STEP 3- fitness function \rightarrow @fitness \rightarrow No. of variables \rightarrow 09 \rightarrow start

File Help										
Problem Setup and Res	sults								Options	
Solver: ga - Genetic Al	laorithm							~	Population	/
Problem	,								Population type:	Double vector 🗸
Fitness function:	@fitness								Population size:	● Use default: 20
Number of variables:	9									O Specify:
									Creation function:	Constraint dependent
Constraints:				-						
Linear inequalities:	A:			b:						
Linear equalities:	Aeq:			beq:					Initial population:	Use default: []
Bounds:	Lower:			Upper:						O Specify:
Nonlinear constraint f	unction:								Initial scores:	• Use default: []
Integer variable indice	es:									O Specify:
Run solver and view res	ults								Initial range	Use default: [0:1]
Use random states	from pro	ious sup							initial range.	
	nompre	nous run								O Specify:
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Objective function value:	0.700143	3765515728						^		
Optimization terminated:	average d	nange in the fitr	ess value less th	an options	.TolFun.					
									Colortion	
								~		
Final point:									Selection function:	Stochastic uniform
1	2	4	5 6		,	0	0			
0.608 0.324	0.7	34 0.945	0.398	0.781	1.589	•	0.704	0,796		
									Reproduction	
<								>	Elite count:	● Use default: 2

<u>Fig 5.9</u>

File Help Problem Setup and Results Options Quick Reference << Generation • Use default: 100 Solver: ga - Genetic Algorithm Genetic Algorithm Solver O Specify: This tool corresponds to the ga function Prob Fitness function: @fitness Time limit: • Use default: Inf Click to expand the section below co Number of variables: 11 O Specify: Problem Setup and Results • Use default: -Inf Constraints: Fitness limit: Problem Linear inequalities: A: b: O Specify: Constraints Linear equalities: Aeq: beq: Export To Worksr Bounds: Lower: Upper Run solver and view results Nonlinear constraint function Export problem and options to a MATLAB structure named: optimproblem Options Integer variable indices: Include information needed to resume this run Specify options for the Genetic Algorithm Run solver and view results Export options as a variable named: options Population Use random states from previous run Export results to a MATLAB structure named: optimresults Fitness scaling Start Pause Stop OK Cancel Current iteration: 51 Selection Reproduction Obtimization running. Objective function value: 0.8980333119727675 Optimization terminated: average change in the fitness value less than options.TolFun. Plot functions Plot interval: Mutation **AV** Best fitness Best individual Distance Final point: Crossover Expectation Genealogy Range 2 3 4 5 6 7 8 9 10 11 0.279 0.692 0.612 0.877 0.351 0.056 0.675 0.792 0.575 0.45 0.811 Migration Score diversity Scores Selection Max constraint Stopping Constraint parame Custom function: Hybrid function - Output function

STEP 4- File \rightarrow Export to workspace \rightarrow Export to a MATLAB structured named \rightarrow ok

<u>Fig 5.10</u>





Fig 5.11

STEP 6- Ok

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Select a file to view details	<pre>19 20 - rmse = sqrt((1/m)*sum((output(:,1) - output(:,2)).^2)) Command Window rmse = 7.4334 fs >></pre>	

<u>Fig 5.12</u>

CHAPTER ~ 6

RESULTS AND DISCUSSIONS

6.1 EMPIRICAL EQUATION:-

6.1.1 <u>EMPRICAL EQUATION RELATING REBOUND HAMMER VALUE WITH</u> <u>ACTUAL</u>

Proposed model:-

$$Y = a_1 w^{b_1} + a_2 R^{b_2} + a_3 \sin w + a_4 e^{-R} + a_5 \sin R + a_6$$

Where,

 $a_1, a_2, a_3, a_4, a_5, a_6, b_1, b_2$ are chromosomes

R= Rebound hammer values

W= Weight of the sample

Y= compressive strength value obtained from empirical equation

After optimization the obtained value of the chromosome:-

 $a_1=0.424$, $a_2=0.77$, $a_3=0.202$, $a_4=-1.072$ $a_5=1.157$ $a_6=0.376$ $b_1=-0.129$ and $b_2=0.997$

So the GP model is,

 $Y = 0.424w^{-0.129} + 0.77R^{0.997} + 0.202\sin w - 1.072e^{-R} + 1.157\sin R + 0.376$

The rmse (root mean square error) obtained after optimization = 6.774%

The effectiveness of proposed model is summarized below in Table 6.1

<u>WEIGHT</u>	RH	Actual f _{ck}	Predicted f _{ck}
8.2	30	14.43	21.61158
8.12	32.2	14.8	22.24864
8.23	31.9	14.3	23.73456
8.28	30.1	25.67	25.70461
8.33	34.9	17.33	27.07767
8.29	32.6	15.11	20.79439
8.2	38	23.11	27.17456
8.23	39	26.67	28.70381
8.28	41.1	26.67	27.88225
8.22	41.2	21.78	27.85298
8.18	31.6	15.8	22.18368
8.32	35.5	23.1	26.98687
8.12	39.4	19.32	23.04721
8.21	40	30.22	32.21161
8.26	41.6	32	31.76373
8.19	37.5	29.33	29.22385
8.13	43.3	31.11	33.13056
8.19	39.8	32	32.19735
8.24	42.5	27.11	32.09263
8.2	40.3	30.67	32.17359
8.17	32.8	20.88	27.02117
8.14	33.6	20.67	23.44011
8.11	33.8	20.44	27.44266
8.106	35.8	26.22	27.0718
8.124	39	24.44	27.71115
8.128	36	25.33	27.17014
8.178	37.33	32	28.90702
8.026	38.2	29.77	30.54902

PREDICTED RESULTS FOLLOWING PROPOSED MODEL

TABLE 6.1

8.122	36.9	31.11	28.17223
8.114	37.8	30.22	29.80194
8.01	32.7	21.78	26.92645
8.22	34	22.22	27.40438
8.21	37.9	22.22	25.98585
8.126	41.7	28.44	31.76952
8.2	36.7	30.67	27.87142
8.262	38.5	28.44	31.03711
8.246	41.4	32.44	31.79567
8.242	41.8	33.03	31.76621
8.186	39.4	31.78	32.04294
8.298	40.7	30.67	32.03587
7.48	42.5	28.89	32.09758
7.6	40.1	32	32.21562
7.66	40.1	32	32.21798
7.86	39.2	26.22	31.91077
7.84	39.3	32.88	31.98909
7.64	40.1	27.55	29.21727
7.86	42	29.33	31.82196
7.94	41.7	27.11	26.77717
8.14	37.5	30.22	29.2272
8.22	39.9	38.22	32.20765
8.14	38.7	35.55	31.34141
8.36	40.3	36.22	33.15944
8.26	39.3	34.66	31.9705
8.28	38.8	36.88	31.46424
8.28	42.5	37.33	32.08923
8.29	41.7	36.2	31.75722
8.28	41.6	35.55	31.762
8.26	40.8	35.55	31.99997
8.24	42.5	34.22	32.09263

8.22	40.3	40.44	37.17208
8.32	42	36.44	31.79805
8.26	41	33.77	31.9212
8.36	41	36.44	31.9118
8.16	40.1	39.55	32.20973
8.01	32.7	38.6	30.92645
8.22	34	38.6	33.40438
8.21	37.9	35.11	29.98585
8.126	41.7	32.88	31.76952
8.2	36.7	31.11	27.87142
8.262	38.5	30.22	31.03711
8.246	41.4	40.77	36.79567
8.242	41.8	36.22	33.76621
8.186	39.4	35.77	31.04294
8.298	40.7	39.7	32.03587
8.28	45.7	47.55	36.8151
8.214	44	47.55	39.40622
8.239	47.9	46.66	36.5331
8.27	41.7	40.44	35.75899
8.22	46.7	40.88	35.91034
8.281	48.5	38.92	36.66017
8.26	41.4	39.11	31.7945
8.263	41.8	40	35.76446
8.25	39.4	35.55	32.03802
8.258	40.7	39.7	32.03939

The more variation is observed for the concrete of lower strength. To compare the actual value and the predicted value a regression analysis was performed using Excel . The regression model is shown in fig. 6.1. The linear regression coefficient was found to be 0.9569 which is in good agreement



Fig 6.1 Regression curve for Rh data

6.1.2 <u>EMPRICAL EQUATION RELATING REBOUND HAMMER & ULTRASONIC</u> PULSE VELOCITY VALUES WITH ACTUAL

Proposed model:-

$$Y = a_1 w^{b_1} + a_2 R^{b_2} + a_3 v^{b_3} + a_4 \sin R + a_5 e^{-v} + a_6$$

Where,

 $a_1, a_2, a_3, a_4, a_5, a_6, b_1, b_2, b_3$ Are chromosomes

R= Rebound hammer values

W= Weight of the sample (Kg)

V= Ultrasonic pulse velocity (m/s)

Y= compressive strength value obtained from empirical equation

Now, the required values of the variables obtained after optimization are:-

 $a_1=0.608$ $a_2=0.734$ $a_3=0.398$ $a_4=1.589$ $a_5=0.704$ $a_6=0.796$ $b_1=0.324$ $b_2=0.945$ and $b_3=0.781$

So the GP model is,

 $Y = 0.608w^{0.324} + 0.734R^{0.945} + 0.398v^{0.781} + 1.589\sin R + 0.704e^{-v} + 0.796$

The Root mean square error obtained after optimization = 7.4334%

WEIGHT	RH	VELOCITY	TIME	Actual f _{ck}	Predicted f _{ck}
8.2	30	4321	34.2	14.43	25.15644592
8.12	32.2	4223	33.6	14.8	26.74137311
8.23	31.9	4312	33.2	14.3	26.40651042
8.28	30.1	4518	33.2	14.67	24.95571518
8.33	34.9	4425	33.9	17.33	27.18276204
8.29	32.6	4298	34.9	15.11	25.35879159
8.2	38	6024	24.9	23.11	27.22824088
8.23	39	5682	26.4	26.67	27.36409748
8.28	41.1	5792	25.9	26.67	27.24847296
8.22	41.2	5906	25.4	21.78	27.08615968
8.18	31.6	5432	31.4	15.8	25.67408319
8.32	35.5	5231	34.3	16.1	27.22540447
8.12	39.4	5432	34.8	19.32	26.71031449
8.21	40	5682	26.4	30.22	27.57782166
8.26	41.6	5792	25.9	32	29.16783552
8.19	37.5	6024	24.9	29.33	28.7713884
8.13	43.3	5906	25.4	31.11	27.62787209
8.19	39.8	6148	24.4	32	29.03214768
8.24	42.5	5792	25.9	27.11	27.29388604
8.2	40.3	5682	26.4	30.67	27.54658709
8.17	32.8	4360	34.4	20.88	27.32164625
8.14	33.6	4237	35.4	18.67	26.75735572
8.11	33.8	4121	36.4	20.44	26.00181762
8.106	35.8	4598	32.3	26.22	26.70865587
8.124	39	4559	32.9	24.44	27.06423478
8.128	36	4491	33.9	25.33	27.16634272
8.178	37.33	4491	33.4	32	27.86393389

PREDICTED RESULTS FOLLOWING PROPOSED MODEL

TABLE 6.2

8.026	38.2	4298	34.9	29.77	29.01420844
8.122	36.9	4425	33.9	31.11	27.63380724
8.114	37.8	4360	34.4	30.22	28.540276
8.01	32.7	4298	34.9	21.78	27.38440958
8.22	34	4360	34.4	22.22	27.48423953
8.21	37.9	4178	35.3	22.22	26.86967444
8.126	41.7	4559	32.9	28.44	28.99437739
8.2	36.7	4425	33.9	30.67	27.50135566
8.262	38.5	4360	34.4	28.44	29.15021508
8.246	41.4	4464	33.6	32.44	29.21498527
8.242	41.8	4335	34.6	33.03	29.44025027
8.186	39.4	4298	34.9	31.78	29.73513161
8.298	40.7	3580	41.9	30.67	27.44720853
7.48	42.5	4298	34.9	28.89	27.57387248
7.6	40.1	4360	34.4	32	29.60456404
7.66	40.1	4360	34.4	32	29.61075909
7.86	39.2	4178	35.9	26.22	27.89080324
7.84	39.3	4178	35.9	32.88	29.92407541
7.64	40.1	4298	34.9	27.55	27.73610785
7.86	42	4360	34.4	29.33	29.36204973
7.94	41.7	4386	34.2	27.11	27.30894125
8.14	37.5	4630	32.4	34.22	29.75471241
8.22	39.9	4559	32.9	38.22	29.29172576
8.14	38.7	4464	33.6	35.55	29.07302601
8.36	40.3	4559	32.9	36.22	29.27354748
8.26	39.3	4587	32.7	34.66	29.14954866
8.28	38.8	4630	32.4	36.88	28.84108928
8.28	42.5	4559	32.9	37.33	29.14372633
8.29	41.7	4386	33	36.2	29.03555786
8.28	41.6	4274	35.2	35.55	29.60396292

4491 4425 4386 4261	33.4 33.9 34.2	35.55 34.22	29.28967637 29.39644461
4425 4386 4261	33.9 34.2	34.22	29.39644461
4386 4261	34.2	40.44	
4261		40.44	29.5929236
	35.2	36.44	29.61237372
4335	34.7	33.77	29.57561834
4312	35.3	36.44	29.73862254
4518	33.4	39.55	29.40604531
4630	34.9	38.6	28.38675099
4630	34.4	38.6	28.48613101
4464	35.3	35.11	28.87175421
4298	32.9	32.88	28.99252307
4360	33.9	31.11	28.95008904
4237	34.4	30.22	29.14931646
4491	33.6	41.77	29.21517506
4518	34.6	42.22	29.4415508
4399	34.9	41.77	29.73586147
4580	41.9	39.7	29.45491827
4559	35.9	47.55	31.13174378
4587	34.8	47.55	30.71499768
4601	34.1	46.66	31.43271353
4360	34.9	40.44	29.52131495
4559	36.3	40.88	29.22977971
4532	35.4	38.92	28.80730526
4630	35.6	39.11	29.72916499
4360	36.6	40	29.95114203
4491	33.9	35.55	29.48686008
4580	40.3	39.7	29.0560001
	4261 4335 4312 4518 4630 4630 4464 4298 4360 4237 4491 4518 4399 4580 4559 4587 4587 4587 4587 4587 4587 4587 4587	426135.2433534.7431235.3451833.4463034.9463034.4446435.3429832.9436033.9423734.4449133.6451834.6439934.9458041.9455935.9458734.8460134.1436034.9455935.4460134.1436034.9458041.9458035.6436035.6436036.6449133.9458040.3	426135.236.44433534.733.77431235.336.44451833.439.55463034.938.6463034.438.6464435.335.11429832.932.88436033.931.11423734.430.22449133.641.77451834.642.22439934.941.77455935.947.55460134.146.66436034.940.44455936.340.88453235.438.92463035.639.11436036.640449133.935.55458040.339.7

The more variation is observed for the concrete of lower strength.To compare the actual value and the predicted value a regression analysis was performed using Excel .The regression model is



shown in fig. 6.2. The linear regression coefficient was found to be 0.945 which is in good agreement.

Fig 6.2

CHAPTER ~7

CONCLUSION

7.1 CONCLUSION:-

The present work is an attempt to formulate the correlation equation using rebound hammer value and rebound hammer value, UPV value and actual compressive strength of cubes. The techniques used for correlation in genetic programming. The following conclusion are drawn from the study:-

- The GP technique is convenient tool for accurate prediction of cube compressive strength from NDT results. The proposed models provide good accuracy in order of 6.74% using RV and 7.44% involving RV and UPV values.
- 2. The proposed models showed higher accuracy for cubes of higher strength.
- 3. The model involves only rebound value provided higher accuracy. This showed that UPV values are not reliable to predict the compressive strength. They only represent the homogeneity and soundness of the concrete specimen.
- 4. The regression analysis between the actual strength and predicted strength from proposed models showed better correlation with only RH values.
- 5. The regression coefficients 0.95 and 0.94 are obtained when RH values and RH & UPV values are considered respectively.
- 6. The errors from the empirical models are in order of 6.744% (for RH values) and 7.4434% (for RH and UPV values), which are much less than the code specified value of $\pm 25\%$.
- 7. The prediction would have been more accurate if more experimental data have been available.

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