



## Forecasting Noisy Realized Volatility of Gold Based Financial Assets in India

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### Abstract

*Gold is the main metal that leads and dictates terms to the world's economy by directing conditions to cash administration and monetary policies. It is additionally named as a standout amongst the most crucial medium of trade all inclusive for a very long time. The investigation unfurls the nearness of instability and use in the item valuing tried observationally utilizing returns of time arrangement information that comprises of every day closing prices of Gold Futures, Gold ETF's and Gold Spot for a long time period from 1<sup>st</sup> April, 2011 to 31<sup>st</sup> March 2017. The present examination explores the effect of unpredictability and use impact by method for value change in Gold Futures, Gold ETF's and Gold Spot in Indian situation. The examination uncover that the factors exhibit the stationary idea of gold ETF's, Futures and Spot utilizing ADF and PP test. It was additionally watched that in all the three there was background noise no ARCH impact. In the present investigation it was clear that, there exist unpredictability and use impact when tried utilizing GARCH family models. The different GARCH family tests realness was kept an eye on the premise of Akaike Info Criterion, (AIC) and Schwarz Info Criterion, (SIC). The instability continues for a significant long stretch in future and the residuals have no ARCH impact amid the examined period. While, the presence of use impact or hilter kilter instability was available in the returns of gold ETF's, futures and spot utilizing E-GARCH and T-GARCH demonstrate. The investigation watched that, negative data is consumed rapidly in the market and the revision in costs maintains for a drawn out period. This awry impact (use) is caught by EGARCH and TGARCH models. At long last, it will be inferred that, negative stuns actuates huge impact on restrictive change.*

**Key Words:** *Volatility, Gold ETF's, Gold Futures, Gold Spot, ARCH family test, Akaike Info Criterion, Schwarz Info Criterion.*

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### Introduction

In the present situation interest in resources like Mutual Funds, ETF's, stocks, futures, securities and options is a monotonous undertaking as the unpredictability proposes new difficulties to the financial specialist's portfolio. Financial specialists amuse are blurring ceaselessly as the interests in physical resources like gold, silver and different valuable metals costs are increasing persistently because of mark to market. Financial specialist's for this very reason is befuddled and dumbfounded where, when and how to put resources into and which advantage for be chosen. There is an issue whether to put funds into risky or risk free resources or in ideal blend. Amid late years it was important that, item costs and the level of interest in products move up's essentially making it difficult to contribute. In a developed item subsidiaries advertise value disclosure and hazard administration is related with extraordinary occasional varieties sought after and supply of products. Fates costs are for the most part alluded to as indicators and makers of future spot costs (Samuelson, 1965).Commodity futures have a tendency to give guidance to spot costs consequently helping in value revelation and also bringing about minimization of value changes. Subsequently, value assurance in subordinates markets ends up noticeably essential as it gives sign to value revelation in spot markets of the basic items. The proficiency of a futures trade relies on the capacity to guarantee that the costs of the agreements exchanged on the trade reflect free market activity (World Bank, 1996). On the off chance that the fates' costs don't delineate the common request supply circumstance because

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of any reason then they may tend to spread wrong flags to the spot markets and in this manner prompt increment in value chance. This demonstrates, negative data is reduced by the market and it has long haul affect on value assurance and disclosure. Moreover, increment in value hazard could be seen in the states of shortfall supply of wares. The Indian item trades have watched a sharp development in exchanging volumes and turnover as of late and are expanding quickly. Interest in ware futures is currently filling in as a discernible contrasting option to customary interests in securities exchanges (Mishra, 2009).

Gold is frequently considered as another option to the share trading system as far as making supporting. Putting resources into offers can give a higher return since financial specialists get returns and conceivable development in share capital. In the midst of monetary turmoil or retreat, the estimation of offers tends to fall as the instability increments. In this way, financial specialists may offer offers and purchase gold and its designated resources in order to make use and guarantee support against chance. Subsequently, fear over a retreat tend to build the estimation of gold as individuals move from more unsafe securities exchange to gold spot and futures (Pettinger, 2011). The cost of gold can be profoundly unpredictable because of worldwide weights, money assurance and risk off settings. It is trusted that there is gold air pocket, when the economy comes back to ordinary, individuals may feel gold is exceptionally exaggerated and individuals could watch a fall in the cost of gold like, the mid 1980s (Bhansali, 2009). An adjustment in supply could modify the cost of gold. On the off chance that there is a sharp increment underway, the cost is probably going to fall. Nonetheless, the supply of gold is moderately steady. The vacillations in value have a tendency to moderately happen because of changes sought after. It can be evaluated dependably that gold and macroeconomic factors are associated factors and supplement each different as and when required (Pettinger, 2011).

The other findings had significant ramifications in both the hypothesis and routine with regards to money related financial matters and econometrics. It has propelled new model building, for example, the rise of ARCH models and the later Stochastic Volatility models. Displaying unpredictability as a different procedure permits the investigation of its connection with the related return process, which prompts the revelation of unbalanced instability (Engle, 1982; Bollerslev 1986; Andersen et. al, 2001). The essential investigation recorded the instability asymmetry, and gave a clarification in view of the Leverage Effect" speculation: A drop in the estimation of the stock has negative restore that builds the budgetary use (obligation to-value proportion), which makes the stock more hazardous and expands its unpredictability (Black, 1976 and Christie, 1982).

The paper is centered around finishing up the mean models and proposes gold futures, ETF's and spot does not have ringer formed bend but rather it's contrarily skewed. This shows costs are pushed down wards and background noise holding on for delayed period and has the ARCH impact. Curve impact demonstrates the time arrangement factors or the residuals that are created through the underlying models indicate wide swings concerning jog line. The observational investigation additionally attempted to catch this impact through various GARCH family models as high inconstancy and high unpredictability has been found in day by day gold fates and spot returns. The GARCH sort models are the better models in depicting return arrangement having the property of changing fluctuation level. It has been tried factually and experimentally (Mittal et. al., 2012). An examination of Volatility grouping is checked utilizing GARCH (1, 1) and GARCH-M (1, 1) models. The Leverage in evaluating is checked utilizing T-GARCH and GJR GARCH demonstrate. The proficiency of the instability and use show is kept an eye on the premise of Akaike Info Criterion (AIC) and Schwarz Info Criterion (SIC).

## Review Of Literature

Instability and Leverage impact are the two imperative phrasings that review advertise flightiness winning for a drawn out period. It was watched that when unpredictability grin the



business sectors take off and when markets summon the instability debilitate. In this way, unpredictability hold a key in choosing speculator's fate and different investigations were observationally broke down to get the job done the examination. Use needs to assume a more noteworthy part in overseeing instability when financial specialists tend to rearrange their positions. The exploration considered the economy of the world gold market as a position of ordinary speculation and watched new pinnacles and bottoms in the gold costs as a marker of market shakiness as entirety. The examination brings about a substitute venture as indicated by the harmony between the free market activity conditions that influences the economy at a substantial scale. The examination observationally test the shakiness of gold costs utilizing ARCH LM test and GARCH (2,1) show inferring that the quantity of gold costs were unpredictable and instability was barred (Alptekin et. al, 2010) .

The examination concentrated on conventional gold returns in the market those outcomes in securing cost of gold and making fence against swelling. Gold as a ware is additionally considered as a support against dubiousness and an innocuous asylum for venture. The exploration demonstrated that various belonging normally related with gold were just dynamic in a straightforward relapse plot yet fundamentally change in a different relapse diagram. An expressive and econometric examination of gold and US money related and monetary factors for once-a-month information from the time of 1979 - 2011 verifies that gold aides as a support against a delicate US dollar and against cutting edge item sums. Gold isn't a support against shopper rate expansion (Baur, 2011).

The examination visualizes the part of gold as a safe haven and the tests fundamentally presumes that, crunch arranges continuously unmistakable by subsidence's and bear markets. Furthermore it was researched utilizing ARMA-GARCH-X display that contingent co-fluctuations emerge amongst gold and stocks returns. The relapses was connected on month to month information for gold and various securities exchange lists and the investigation unfurls that, gold prevailing similar to a place of refuge against all the stock files. The result shows that as the market moves in retreats or loving squeeze, the covariance amongst gold and stocks returns is seen as negative or invalid in all conditions (Coudert and Raymond, 2011).

The investigation utilized time fluctuating difference based GARCH procedure to catch change in instability and concentrate its effect on Indian Securities Market that looked at the adjustment in unpredictability of Indian Stock Market with U.S. Stock Market (Rastogi and Srivastava, 2011). It was recognized utilizing GARCH models that the Indian Stock Market Volatility represents asymmetry the examination uncovered the nearness of use impact in money markets and demonstrated the littler stuns that influence the returns in Indian Stock Market because of news affect (Krishnan and Mukherjee, 2010). The examination researched the share trading system instability in developing securities exchanges of India and China utilizing every day shutting cost and closed the nearness of non-linearity through BDSL test while contingent heteroskedasticity was recognized through ARCH-LM test. The discoveries uncovered that the GARCH (1, 1) MODEL effectively catches the non linearity and instability grouping (Joshi, 2010).

The examination evaluated the instability of BSE-500 stock record and its related adapted realities more than 10 periods utilizing ARCH models The investigation inferred that GARCH(1, 1) Model clarifies the unpredictability of Indian Stock Market and its adapted certainties including instability bunching, fat tail and mean returning palatably (Goudarzi and Ramanarayan, 2010). An exact investigation broke down the Chinese Stock Market conduct by picking the information from Shanghai Composite Index and Shenzen Stock Index and utilized ARIMAEARCH-M (1, 1) and ARIMA-TARCH (1,1) model to break down the unpredictability of money related time arrangement with the attributes of bunching, asymmetry, and pinnacle and fat tails. Another examination researched the uneven idea of U.S. Stock Market return and



impact of heteroskedasticity on stock return instability. The examination additionally broke down the connection between stock return, restrictive unpredictability and standard residuals. GARCH (1, 1) and TGARCH (1, 1) to test the heteroskedasticity and unbalanced nature of securities exchange returns separately and finished up the nearness of non linearity, heteroskedastic impact and awry nature of stock returns (Kumar and Dhankar, 2011).

### Objectives

- To study presence of ARCH effect in the studied variables,
- Testing Volatility and presence of Leverage effect in Gold futures, ETF's and spot
- Validating the authenticity of studied models.

### Research Methodology

#### Hypothesis

- H<sub>01</sub>: The returns of Gold futures, ETF's and spot are not normally disseminated.
- H<sub>02</sub>: The returns of Gold futures, ETF's and spot are non-stationary.
- H<sub>03</sub>: The returns of Gold futures, ETF's and spot are non- heteroscedastically distributed.
- H<sub>04</sub>: There is no volatility impact on the returns of Gold futures, ETF's and spot.
- H<sub>05</sub>: There is no leverage impact caused on the returns of Gold futures, ETF's and spot.
- H<sub>06</sub>: There is no ARCH impact on the returns of Gold futures, ETF's and spot.

#### The Study

The daily returns of Gold Futures, ETF's and Spot as the variables and they are taken from ([www.mcxindia.com](http://www.mcxindia.com)) and ([www.nscindia.com](http://www.nscindia.com)) for the period 1<sup>st</sup> April, 2011 to 31<sup>st</sup> March 2017. The study uses secondary data and 1478 observations of the daily closing prices are used to study the existence of volatility in the variables.

#### Tools Used

The time series data is Heteroscedastic and converted to homoscedastic by applying the formula:  $\text{Returns} = \ln(P_{t+1} - P_t / P_t)$ . Descriptive Analysis, Unit Root Test, Regression, Test of Heteroscedasticity, ARCH family test i.e. GARCH (1, 1), GARCH- M (1, 1), E-GARCH (1, 1), and T-GARCH (1, 1), models are used in the study. The tools are applied using E- views 7 statistical software.

#### Results And Analysis

The Descriptive insights ascertained in Table-1 proposes that, Gold Futures, ETF's and spot have positive returns as the qualities being 0.0002 and 0.002077 and 0.000367 individually showing that costs has slowly expanded over the period. The skewness in unmistakable measurements demonstrating that, the profits are decidedly skewed, showing that there is a high likelihood of procuring returns as the qualities are negative - 0.78045, - 0.06885 and - 0.45816. This is watched that the ascertained values are < Mean. Standard Deviation it continues revealing insight into recorded estimations of unpredictability caused in gold fates, ETF's and spot. As the figured value is high if there should be an occurrence of gold ETF's is 0.453999 and gold fates is 0.268767 shows high instability is normal in returns by time. In Gold recognize the value is low 0.006497 inferring low instability in the profits of physical gold as it is fence against swelling. The figured estimations of Kurtosis are 24.20299, 6.015428 and 7.574079 > 3, demonstrating that the arrival arrangement have fat tail and don't take after an ordinary circulation. The Jarque-Bera test measurements propose that at 95% level of huge the p esteem for every single concentrated variable is 0. Thus the invalid speculation expressing that the factors are not typically circulates is acknowledged.

Table- 1. General statistical tools applied using Descriptive Statistics

	ETF	GOLDFU	GOLDSP
Mean	0.002077	0.0002	0.000367
Median	-0.00027	0.008244	0.000223



Maximum	4.189779	1.400402	0.030841
Minimum	-4.038033	-1.18722	-0.04649
Std. Dev.	0.453999	0.268767	0.006497
Skewness	-0.780485	-0.06885	-0.45816
Kurtosis	24.20299	6.015428	7.574079
Jarque-Bera	27835.88	561.1329	1340.167
Probability	0	0	0
Sum	3.069444	-0.29483	0.543103
Sum Sq. Dev.	304.4315	106.692	0.062336
Observations	1478	1478	1478

Source: Author's calculation based on Secondary Data using e- Views7.

The table-2 beneath contemplates unit root in the arrangement tried utilizing Augmented Dickey Fuller (ADF) and Phillips Perron (PP) Tests and the ARCH-Im test demonstrates the nearness of heteroscedasticity. The p estimations of ADF and PP test connected on factors to be specific Gold ETF's, fates and spot have values 0 under 0.05. This prompts a conclusion that, the time arrangement information for the whole examination time frame is stationary. Both the ADF and PP test measurements detailed in table-2 dismiss the theory at 5% level with the basic estimation of – 3.43 each for every concentrated variable. Henceforth, the consequences of both the tests affirm that the arrangements are stationary.

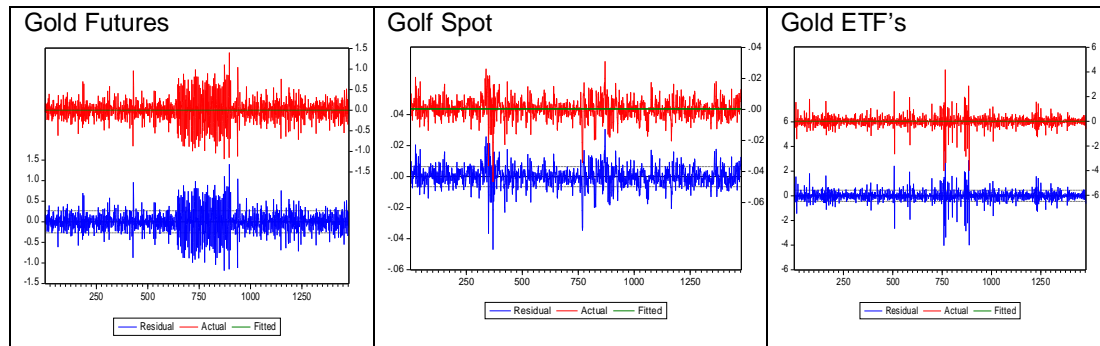
Table- 2. Result of Unit Root using ADF &PP Test

VALUE	ADF (GOLDFU)	PP (GOLDFU)	ADF (GOLDSP)	PP (GOLDSP)	ADF (GOLDETF)	PP (GOLDETF)
t- statistics	-20.18593	-48.80984	-11.32886	-21.55997	-22.56249	-102.8339
Prob.	0	0.0001	0	0	0	0.0001
Critical Value						
1%	-3.434597	-3.43457	-3.434597	-3.43457	-3.434588	-3.43457
5%	-2.863303	-2.863291	-2.863303	-2.863291	-2.863299	-2.863291
10%	-2.567757	-2.567751	-2.567757	-2.567751	-2.567755	-2.567751

Source: Author's calculation based on Secondary Data using e- Views7.

From the figure 1, 2 and 3 it is deduced that the time of low unpredictability has a tendency to be trailed by time of low instability for a drawn out period and the time of high unpredictability is trailed by time of high instability for a delayed period, which implies the unpredictability is bunching and the arrival arrangement differ around the consistent mean however the difference is changing progressively with time. It is watched that drawn out patterns are watched and recurrence of value adjustment is high and the market is discounting all of information and revising the values on higher price band.

F. 1 & 2: Indicating white noise and trend of prices Gold Futures and Gold Spot



Source: Author's calculation based on Secondary Data using e- Views7.

The ARCH-lm test is connected to discover the nearness of ARCH impact in the residuals of gold futures, spot and ETF's profits. The table-3 beneath gives that the ARCH-lm test insights is profoundly huge at 5% level as the p is 0 that is  $< 0.05$ . In this way the invalid theory of 'no curve impact' is rejected at 5% level, which affirms the nearness of ARCH impacts in the residuals of time arrangement models in the profits. Consequently the outcomes warrants for the estimation of GARCH family models to be connected further. After unpredictability grouping is affirmed with return arrangement and stationarity utilizing ADF and PP test, heteroscedasticity impact utilizing ARCH-lm test, the examination concentrates on deciding the best fitted GARCH model to the studied series of returns.

Table- 3. Results showing Heteroskedasticity Test: ARCH

ARCH- LM Test Statistics	GOLD FUTURES	GOLD SPOT	Gold ETF's
	172.9881	256.319	153.92
Prob.	0	0	0

Source: Author's calculation based on Secondary Data using e- Views7.

Further, GARCH demonstrate is utilized for displaying the unpredictability of return in Gold futures, spot and ETF's profits. The consequence of GARCH (1,1) and GARCH-M (1,1) models appeared in table-4 uncovers that the parameters of GARCH show coefficients viz., consistent ( $\omega$ ), ARCH term ( $\alpha$ ), GARCH term ( $\beta$ ) are exceedingly huge at 5% level. In the contingent change condition in GARCH (1,1) and GARCH-M demonstrate gold futures have  $\beta$  values as 0.77024; 0.764784 and ETF's have values 0.7348; 0.7496 that is impressively more noteworthy than gold spot 0.341 and 0.321. The  $\alpha$  coefficient estimations of the contemplated factors are low than  $\beta$  i.e. 0.183204; 0.185893 for gold fates 0.226; 0.241 and gold ETF's value are 0.2015 and 0.2011 individually. This affirms the market has longer recollections than one period and the unpredictability is more delicate to its slacked value than it is to new shocks in the market value. Henceforth it is said that unpredictability is relentless in both the business sectors however the correction is more continuous in fates and ETF's contrasted with spot. The sizes of the parameters  $\alpha + \beta$  decide the unpredictability in time arrangement and the qualities under GARCH (1,1) Model are 0.953444; 0.567491; 0.93634 and GARCH M Model is 0.950677; 0.562679 and 0.93084 individually. This demonstrates value are nearer to solidarity showing shocks will endure in the estimating for an excessive number of future periods to come. Since the hazard return parameter is certain and noteworthy at 5% level, it demonstrates that there is a positive connection amongst risk and return.

Further, ARCH-lm test is utilized to check ARCH impact in residuals and from the outcomes, it is induced that the figured estimation of  $p > 0.05$ . In GARCH (1,1) Model the values are 0.7559, 0.4478 and 0.0737 where as in GARCH M Model it is 0.8985, 0.4402 and 0.1063 individually. This presumes the invalid theory of 'no ARCH impact' is acknowledged. As it were, the test



measurements don't bolster for any extra ARCH impact in the residuals of the models showing the fluctuation condition is very much determined for the market. The GARCH-M (1, 1) show is assessed by permitting the mean condition of the arrival arrangement to rely upon an element of the contingent change the steady in mean condition is huge at 5% level. This shows there is an anomalous return for the market. The table 4 deduced that the coefficient of contingent change ( $\lambda$ ) in the mean condition esteem is certain as the ascertained esteem is 0.21683, 0.18495 and 0.103107 that is factually immaterial. This suggests there is no critical effect of unpredictability on the normal return of gold futures, spot and ETF's. Promote the examination demonstrates absence of hazard return exchange off after some time. Approving the test for the most ideal model among GARCH (1,1) the investigation demonstrated that, log probability value for gold futures, ETF's and spot are 76.822, 11576.42, 658.6965; AIC value being - 0.0952 , - 7.4321 and - 0.896748; and the SIC value are - 0.084203, - 7.44138 and - 0.911087 individually. While it was watched that in the GARCH-M estimations of log probability, AIC and SIC value littler than GARCH (1, 1). This deduces in every one of the cases GARCH-M has bring down qualities than GARCH (1, 1) demonstrate. Subsequently GARCH (1, 1) Model is preferred indicator of unpredictability over GARCH M Model.

Table- 4: Result showing Volatility using GARCH (1,1) and GARCH- M and proving ARCH effect

Tests	GARCH (1,1) Model			GARCH (M) Model		
	Gold Futures	Gold Spot	Gold ETF	Gold Futures	Gold Spot	Gold ETF
Mean Equation						
$\mu$ (Constant)	-0.002061	0.000269	0.007871	-0.044084	0.000802	0.291557
$\lambda$ (Risk Premium)	0	0	0	0.216835	0.184952	0.103107
Variance Equation						
$\omega$ (Constant)	0.003399	1.11E-05	0.014807	0.003578	1.15E-05	0.01528
$\alpha$ (ARCH Effect)	0.183204	0.226546	0.201501	0.185893	0.241267	0.201151
$\beta$ (GARCH Effect)	0.77024	0.340945	0.734839	0.764784	0.321412	0.729689
$\alpha + \beta$	0.953444	0.567491	0.93634	0.950677	0.562679	0.93084
Log Likelihood	76.82285	11576.42	658.6965	74.86242	5508.32	650.381
Akaike Info Criterion (AIC)	-0.098542	7.432145	0.896748	-0.101302	7.446985	0.95226
Schwarz Info. Criterion (SIC)	-0.084203	7.441138	0.911087	-0.085378	7.569061	0.952085
Heteroskedasticity Test						
ARCH- LM Test	0.080958	0.575777	3.20381	0.016264	0.595107	2.61122
Prob. Chi. Square	0.7759	0.4478	0.0737	0.8985	0.4402	0.1063

Source: Author's calculation based on Secondary Data using e- Views7.



The two models utilized  $\gamma$  to catch the asymmetries impact in the arrival arrangement appeared under EGARCH (1, 1) and TGARCH (1, 1) models. The awry EGARCH (1, 1) display is spoken to in table-5 that uncovered the estimations of ARCH ( $\alpha$ ) 0.561538, 0.535833 and 0.180614 and GARCH coefficient ( $\beta$ ) 0.74881, 0.630629 and 0.864839 individually. Aggregate impact of  $\alpha$  and  $\beta$  are more noteworthy than one as the ascertained value are 1.310348, 1.16646 and 1.045453 announcing that restrictive change is unstable; the evaluated coefficients are measurably huge at 5% level. The  $\gamma$  use coefficient is - 0.02828, - 0.11728 and - 0.508911 demonstrating that the qualities are negative and it is factually noteworthy at 5% level. This shows the use impact consequently amid the examined period. The investigation uncovers that there is a negative connection between's past return and future return (use impact). The examination watched that the qualities take after various bearings i.e. in the event that one expands alternate abatements. Along these lines, EGARCH (1, 1) display underpins for the nearness of use impact in the profits of gold futures, spot and ETF's. At last, the ARCH-Im test measurements demonstrates that the invalid speculation of no heteroscedasticity in the residuals as the computed value is 0.8052; 0.1304; 0.1011 in EGARCH display as figured value are more prominent than 0.05 the invalid theory is acknowledged.

A substitute model to test for deviated instability in the gold futures, spot and ETF's utilizing TGARCH, appeared in table 5 the coefficient of use impact ( $\gamma$ ) values as positive 0.279375, 0.077683 and 0.756545 to be huge at 5% level suggesting that negative stuns or awful news greaterly affect the restrictive change than the positive stuns or uplifting news. The indicative test is performed to test whether the residuals are regularly circulated. The ARCH-Im test measurement for TGARCH (1, 1) display does not demonstrate any extra ARCH impact show in the residuals as the figured value are more prominent than 0.05 in the model demonstrating that the fluctuation condition is all around indicated for gold futures and spot. Approving the test for the most ideal model among EGARCH the investigation demonstrated that, log probability value for gold fates and spot are 5506.269, 5159.595 and 678.0618; AIC value being - 7.444207, - 6.975094 and - 0.924305 while the SIC value are - 7.426283, - 6.95717 and - 0.924305 separately. The T-GARCH display estimations of log probability are 96.25325, 5007.45 and 644.0973; AIC value being - 0.1234, - 7.4458 and - 0.878345 at long last the SIC value are - 8.10556, - 7.42789 and - 0.98627. This proposes in every one of the cases T-GARCH has higher value than E-GARCH display.

Table- 5: Results showing asymmetric Volatility using E- GARCH and T- GARCH and proving ARCH effect.

Tests	EGARCH Model			T-GARCH		
	Gold Futures	Gold Spot	Gold ETF	Gold Futures	Gold Spot	Gold ETF
Mean Equation						
$\mu$ (Constant)	0.00019	0.00061 2	0	-0.015579	0.00025 6	0.02392 2
Variance Equation						
$\omega$ (Constant)	-5.075969	- 5.06353 1	- 3.70379 1	0.003853	1.14E- 05	0.01491 5
$\beta$ (ARCH Effect)	0.74881	0.63062 9	0.86483 9	0.784586	0.32887	0.20474 7
$\alpha$ (GARCH Effect)	0.561538	0.53583 3	0.18061 4	0.023809	0.39667 6	0.27566 1





$\gamma$ (Leverage Effect)	-0.028275	0.11727 7	0.50891 1	0.279375	0.07768 3	0.75654 5
$\alpha + \beta$	1.310348	1.16646 2	1.04545 3	0.808395	0.72554 6	0.48040 8
Log Likelihood	5506.269	5159.59 5	678.061 8	96.25325	5007.45 5	644.097 3
Akaike Info Criterion (AIC)	-7.444207	6.97509 4	0.92430 5	-0.123482	7.44581 1	0.87834 5
Schwarz Info. Criterion (SIC)	-7.426283	6.95717	0.94223	-8.105558	7.42788 7	0.98627
Heteroskedasticity Test						
ARCH- LM Test	0.060753	2.28847 9	40.6276 5	1.072559	0.53301	2.48340 4
Prob. Chi. Square	0.8052	0.1304	0.1011	0.3002	0.4651	0.1153

Source: Author's calculation based on Secondary Data using e- Views7.

## Conclusion and Interpretation

The discoveries of the investigation reasoned that gold futures and ETF's are more delicate when contrasted with gold spot. The spellbinding measurements indicates positive mean of gold futures, ETF's and spot returns takes after upward pattern and low amendment are normal as holding gold in any frame lessens hazard and are named as support against remedy in costs of portfolio. The bend is contrarily skewed deducing that costs take after more upward patterns than descending patterns in the market demonstrating result that market markdown negative data rapidly. Henceforth it is presented that gold market is less influenced by negative data winning in residential or universal markets. It is the monetary condition and full scale financial factors that influence the physical and paper gold costs. The considered factors have unit root utilizing ADF and PP test and it is demonstrate fit to run GARCH family test. The leftover demonstrative test in diagram uncovers that there is repetitive sound the profundity in instability is more in prospects, ETF's and spot showcase.

It is reasoned that gold is financial specialists get a kick out of any type of market physical or paper. In this manner the examination deduced that unpredictability stays in the market for the delayed period in view of high variances upward or downwards in the market. There is no ARCH impact in the profits and they take after GARCH impact including delayed unpredictability for quite a while in the market. The GARCH (1, 1) and GARCH-M demonstrate is clear and watched that within the sight of unpredictability in the market prospects and ETF's are more unstable when contrasted with spot costs. This is on the grounds that prospects and ETF's are stamp to showcase and have competency to change itself progressively in the market. The estimation of  $\alpha$  and  $\beta$  by and large is near solidarity and it well legitimizes that the computed esteems have less value remedies and it progressively overhaul itself for a drawn out stretch of time. At last the test demonstrates GARCH-(1, 1) show is a superior indicator of ware fates and spot unpredictability than GARCH-M display in light of the fact that the figured esteems is high on contrasting AIC and SIC criteria of the two models.

The examination affirms that the negative news is discounted by the market more regularly than the positive news and henceforth advertises changes the value all the more productively in view of negative data and it has long haul affect. To consider use impact E GARCH and T GARCH test were connected and its impact is signified as  $\gamma$  reasoned that gold in all structures is a



superior utilizing apparatus and a phenomenal portfolio hedger. The estimation of  $\alpha$  and  $\beta$  all things considered are more prominent than solidarity reasoning that an ideal mix of spot alongside ETF's and fates. The blend of obligation value blend fences the financial specialists' portfolio everywhere and gives long haul maintainability alongside high likelihood of gainfulness. Curve test demonstrates that there is no ARCH impact terrible clear the nearness of GARCH impact. The TGARCH show likewise demonstrates use impact as the  $\gamma$  esteem is certain and guarantees obligation value blend extent. The best model that demonstrates use impact in light of AIC and SIC is EGARCH being values more noteworthy than TGARCH. At last it is inferred that gold fates and ETF's costs are influenced by gold recognize that transmits unpredictability to gold prospects and ETF's in long haul.

### Suggestions

The investigation proposes that gold futures, ETF's and spot are the instruments that have long haul impact on the financial specialists' portfolio. It is prescribed to hold physical gold to fortify the portfolio. Gold futures and ETF's exchanged auxiliary market gives catalyst to return as far as making proficient portfolios. In the event that the financial specialists or arbitrageurs stop their assets in hazardous resources like stocks and don't take parallel position in gold it will build value chance and give misfortunes to speculators. General speculators are recommended that value, ETF's, futures and spot ought to be financial specialists pleasure and part of each financial specialist's portfolio. In light of the examination one can assess chance return related with futures and spot in view of which ventures can be directed in the market keeping in mind the end goal to accomplish riches boost.

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