

Active Quant: Applied Investment Research

PRESENTER John B. Guerard, Jr. Director of Quantitative Research, McKinley Capital Management, LLC Anchorage, AK

907.563.4488 jguerard@McKinleyCapital.com

Questions to be Answered

- 1. What is the role of Financial Anomalies in Portfolio Construction and Management?
- 2. What is the Role of Forecasted Earnings in creating Expected Returns?
- 3. What are our investment results?
- 4. Can the models be implemented in the world of business?
- 5. What are the limitations of our work?



Portfolio Construction and The Efficient Markets Hypothesis

(Early) Research Includes

- Roberts (1959)
- Sharpe (1964)
- Mossin (1966)
- Treynor and Mazuy (1966)
- Brealey (1966)
- Fama (1970, 1976, 1991)

The Market was held to be **Semi-Strong Efficient**!



Earnings Forecasting and Expected Returns: The Early Literature

Research Includes:

- Cragg and Malkiel (1968)
- Elton, Gruber, and Gultekin (1981)
- Dimson (1986)
- Brush (1983, 2001, 2006)
- Wheeler (1991)
- Brown (IJF 1993)
- Blin, Bender, and Guerard (1995, IJF 1998)

- Guerard (1997)
- Guerard, Gultekin, and Stone (1997)
- Ramnath, Rock, and Shane (IJF 2008)
- Guerard, Markowitz, and Xu (2014)
- Guerard, Markowitz, and Xu (2015)
- Guerard and Markowitz (2018)



Public Model Expected Returns Stock Selection Model

 $TR_{t+1} = a_0 + a_1EP_t + a_2BP_t + a_3CP_t + a_4SP_t + a_5REP_t + a_6RBP_t + a_7RCP_t$

 $+ a_8 \text{RSP}_t + a_9 \text{CTEF}_t + a_{10} \text{PM}_t + e_t , \qquad (1)$

- where: EP = [earnings per share]/[price per share] = earnings-price ratio;
 - BP = [book value per share]/[price per share] = book-price ratio;
 - CP = [cash flow per share]/[price per share] = cash flow-price ratio;
 - SP = [net sales per share]/[price per share] = sales-price ratio;
 - REP = [current EP ratio]/[average EP ratio over the past five years];
 - RBP = [current BP ratio]/[average BP ratio over the past five years];
 - RCP = [current CP ratio]/[average CP ratio over the past five years];
 - RSP = [current SP ratio]/[average SP ratio over the past five years];
 - CTEF = consensus earnings-per-share I/B/E/S forecast, revisions and breadth;
 - PM = price momentum; and
 - e = randomly distributed error term.



Markowitz Mean Variance Portfolio Selection

The Markowitz mean-variance (MV) portfolio construction and management can be summarized as:

minimize
$$w^T C w - \lambda \mu^T w$$
, (2)

where μ is the expected return vector, *C* is the variance-covariance matrix, *w* is the portfolio weights, and λ is the risk-return tradeoff parameter. The estimation of *C* is usually done by a multifactor model, in which the individual stock return R_j of security *j* at time *t*, dropping the subscript *t* for time, may be written like this:

$$R_j = \sum_{k=1}^K \beta_{jk} \, \widetilde{f}_k + \widetilde{e}_j. \tag{3}$$

The nonfactor, or asset-specific, return on security $j, \tilde{e_j}$, is the residual risk of the security after removing the estimated impacts of the *K* factors. The term f_k is the rate of return on factor *k*. The factor model simplifies the *C* as the sum of the systematic risk covariance and diagonal specific variances,



What do Practitioners Believe?

- Diversified Portfolios can offer **Positive Active Returns**
- Financial Anomalies, known in 1986, have Existed and Persisted
- Portfolio Construction requires **Statistically Significant** tilt.
- Portfolio Constraints are useful with several Anomalies.
- The Vast Source of Active Management is Derived from Forecasted Earnings Acceleration in Stock Selection
- **Stronger** in Non-U.S. and EM universes than in U.S. universes
- Price Momentum Risk Premium is MUCH Larger in Non-U.S. and EM universes than in U.S. universes!



Portfolio Construction and Modeling Process





Guerard, Markowitz, and Xu Tilts, 1997-2011

Table 2: Top/Bottom decile spreads of FSGLER

1997 - 2011

Variable	Top 3 decile spreads (<i>t</i>)	Annualized Top 3 decile spreads	Top decile spread (<i>t</i>)	Annualized Top decile spread
EP	0.42% (1.66)	4.43%	0.20% (0.66)	1.40%
BP	0.50 (1.67)	5.21	0.96 (1.45)	9.54
FEP	0.50 (1.95)	5.38	0.54 (2.02)	5.11
CTEF	0.72 (5.85)	8.85	1.16 (7.27)	14.54
EWC	0.70 (3.67)	8.37	1.06 (3.55)	12.36
GLER	1.12 (4.54)	13.55	1.48 (3.67)	17.19

2003 – 2011

Variable	Top 3 decile spreads (<i>t</i>)	Annualized Top 3 decile spreads	Top decile spread (<i>t</i>)	Annualized Top decile spread
EP	0.23% (0.80)	2.267	0.25% (1.08)	2.65
BP	0.80 (1.78)	8.74	0.47 (1.57)	5.21
FEP	0.38 (1.33)	4.12	0.23 (1.39)	2.66
CTEF	1.07 (6.48)	3.37	0.58 (4.88)	7.12
EWC	0.97 (5.79)	12.07	0.60 (1.83)	7.41
GLER	1.33 (3.98)	16.32	0.96 (4.59)	11.78

Source: FactSet and SAS. Data provided may represent varying time periods depending on the concept being discussed. Guerard, J.B., Jr., Markowitz, H.M., & Xu, G. (2015). Earnings forecasting in a global stock selection model and efficient portfolio construction and management. International Journal of Forecasting, 31, 550-560.



Guerard, Markowitz, and Xu (2015) Risk Preferences, 1999-2011

Table 3: Efficient Frontier of the Global Stock Selection Model with VariousPortfolio Optimization Techniques

1999 – 2011

Axioma Statistical Risk Model

Earnings Model or Component	Mean Variance Methodology	Lambda	Annualized Return	Standard Deviation	Sharpe Ratio	Information Ratio	Tracking Error
GLER	M59	1000	15.84	24.97	0.590	0.78	13.11
		500	16.34	24.85	0.590	0.82	12.08
		200	16.37	24.38	0.610	0.85	12.68
		100	15.90	24.61	0.580	0.81	12.66
		5	10.11	19.36	0.440	0.51	8.81
Benchmark			5.59		0.240		
GLER	TaR	1000	16.10	21.93	0.660	0.94	11.18
		500	15.91	21.99	0.651	0.90	11.44
		200	16.09	20.95	0.691	0.97	10.83
		100	14.18	21.24	0.591	0.77	11.23
		5	8.51	20.03	0.344	0.33	8.75
GLER	EAWTaR2	1000	14.80	21.96	0.600	0.94	11.07
		500	14.30	21.65	0.590	0.80	10.87
		200	14.15	20.92	0.600	0.85	10.04
		100	13.49	20.82	0.570	0.80	9.84
		5	10.77	20.79	0.440	0.43	12.18

Source: FactSet and APT. Past performance is not indicative of future returns. Guerard, J.B., Jr., Markowitz, H.M., & Xu, G. (2015). Earnings forecasting in a global stock selection model and efficient portfolio construction and management. International Journal of Forecasting, 31, 550-560.





Table 1: Forecasted Earnings Acceleration and	Stock Selec	tion Modelir	ng in Globa	, Non-US, a	and EM Un	iverses			
MSCI Index Constituents-only									
Axioma Statistical Risk Model and Optimizer									
Mean-Variance Analysis									
Model: Global CTEF GLER TE									
Period: 2003-01-31 to 2016-12-30 (Monthly)		Benchmark:	ACWG						
	Portfolio	Acti	ve	Spe	cific	Mome	entum	Va	lue
	Return	Return	T-Stat	Return	T-Stat	Return	T-Stat	Return	T-Stat
GLOBAL_CTEF-TE4	12.44%	3.89%	2.28	1.36%	1.28	1.18%	6.47	1.66%	4.22
GLOBAL_CTEF-TE6	15.87%	7.32%	3.32	3.89%	2.89	1.65%	7.07	1.84%	4.15
GLOBAL_CTEF-TE8	16.31%	7.77%	3.13	4.13%	2.92	1.63%	6.54	1.85%	3.93
GLOBAL_GLER-TE4	13.28%	4.73%	2.95	1.54%	1.42	0.66%	3.86	2.53%	4.49
GLOBAL_GLER-TE6	16.03%	7.49%	3.61	3.26%	2.44	0.94%	3.88	2.76%	4.62
GLOBAL_GLER-TE8	16.87%	8.32%	3.45	4.27%	2.98	0.92%	3.59	2.73%	4.68
Model: XUS CTEF GLER TE									
Period: 2003-01-31 to 2016-12-30 (Monthly)		Benchmark:	ACWXUSG						
	Portfolio	Acti	ve	Spe	cific	Mome	entum	Va	lue
	Return	Return	T-Stat	Return	T-Stat	Return	T-Stat	Return	T-Stat
XUS_CTEF_TE4	14.11%	6.17%	3.59	3.55%	3.10	1.27%	6.64	1.69%	4.35
XUS_CTEF_TE6	16.27%	8.32%	3.89	3.87%	2.85	1.61%	6.67	1.79%	4.32
XUS_CTEF_TE8	18.05%	10.10%	4.28	4.78%	3.15	1.73%	6.45	1.85%	4.37
XUS_GLER_TE4	13.78%	5.83%	3.67	1.93%	1.81	0.84%	4.22	2.37%	4.44
XUS_GLER_TE6	15.11%	7.17%	3.52	3.10%	2.27	0.84%	3.76	2.58%	4.40
XUS_GLER_TE8	16.22%	8.28%	3.82	4.36%	2.94	0.78%	3.36	2.66%	4.58
Model: EM CTEF GLER TE									
Period: 2003-01-31 to 2016-12-30 (Monthly)		Benchmark:	EMG						
	Portfolio	Acti	ve	Spe	cific	Mome	entum	Va	lue
	Return	Return	T-Stat	Return	T-Stat	Return	T-Stat	Return	T-Stat
EM_CTEF_TE4	16.15%	5.43%	3.37	4.08%	3.27	0.95%	6.17	1.43%	4.21
EM_CTEF_TE6	17.34%	6.62%	3.00	3.76%	2.27	1.31%	5.90	1.79%	4.32
EM_CTEF_TE8	19.76%	9.04%	3.67	5.17%	2.97	1.68%	5.99	2.01%	4.48
EM_GLER_TE4	17.72%	7.00%	4.90	4.69%	3.97	0.04%	0.32	1.88%	4.05
EM_GLER_TE6	19.81%	9.09%	4.59	6.21%	3.91	0.11%	0.56	2.22%	3.97
EM GLER TE8	20.92%	10.20%	4.43	6.55%	3.81	0.19%	0.80	2.39%	4.06

Source: FactSet and Axioma. Past performance is not indicative of future returns. Guerard, J.B., Jr., & Chettiappan, S. (2017). Active quant: Applied investment analysis in emerging markets", Journal of Investing 26, 138-152.





Table 2: Axioma Statistical Risk Model and OptimizerJanuary 2003 – December 2016

	STAT Ris Trackin	sk Model Ig Error					
Model: XUS GLER	4.00	5.00	6.00	7.00	8.00	9.00	10.00
Ann. Port Return	13.18	14.13	14.47	15.22	15.80	15.95	15.95
Ann. STD	20.16	20.56	20.66	20.99	21.20	21.63	21.63
Ann. Active Return	5.33	6.29	6.62	7.37	7.94	8.10	8.10
Ann. Active Risk	6.22	7.14	7.55	7.96	9.16	8.64	8.64
ShR	0.573	0.605	0.619	0.645	0.668	0.662	0.662
IR	0.856	0.880	0.876	0.925	0.975	0.937	0.937
Model: GL GLER							
Ann. Port Return	12.42	14.17	14.78	15.88	16.30	16.80	17.24
Ann. STD	17.82	18.92	19.60	19.98	20.12	20.54	20.64
Ann. Active Return	4.29	6.04	6.65	7.75	8.17	8.67	9.11
Ann. Active Risk	6.04	7.88	8.00	8.57	8.69	9.14	9.41
ShR	0.601	0.659	0.667	0.710	0.726	0.775	0.753
IR	0.710	0.852	0.832	0.905	0.940	0.949	0.968
Model: EM GLER							
Ann. Port Return	18.79	19.79	20.15	20.76	21.16	21.82	22.67
Ann. STD	26.09	26.22	26.34	26.45	26.74	26.95	27.25
Ann. Active Return	8.48	9.47	9.84	10.46	10.45	11.61	12.36
Ann. Active Risk	8.99	9.16	9.36	9.55	10.09	10.22	10.40
ShR	0.655	0.689	0.708	0.721	0.751	0.746	0.769
IR	0.944	1.033	1.062	1.095	1.085	1.128	1.180

Source: FactSet and Axioma. Past performance is not indicative of future returns. Guerard, J.B., Jr., & Chettiappan, S. (2017). Active quant: Applied investment analysis in emerging markets", Journal of Investing 26, 138-152.



Quant Around the Country: LA



Return v.s. Realized Tracking Error

Source: FactSet and Axioma. Past performance is not indicative of future returns. Guerard, J.B., Jr., & Chettiappan, S. (2017). Active quant: Applied investment analysis in emerging markets", Journal of Investing 26, 138-152.





Return v.s. Targeted Tracking Error

Source: FactSet and Axioma. Past performance is not indicative of future returns. Guerard, J.B., Jr., & Chettiappan, S. (2017). Active quant: Applied investment analysis in emerging markets", Journal of Investing 26, 138-152.

> Wharton JACOBS LEVY EQUITY MANAGEMENT CENTER for Quantitative Financial Research

Updated Guerard and Markowitz (2018) Tilts, 2003 -11/2018

Mean-Variance Anomalies Portfolios

Robust Regression Models with Tukey OIF99%

Time Period: 12/2002 -11/2018

		Risk					Risk Factor			
	Risk	Stock	Diale	Risk	Diale		Returns			
	Stock	Specific	RISK	Factors	RISK	Earningo	Mealum-			
Portfolios	Effect	T_Stat	Effect	T_Stat	Effoct	Ziold	Momontum	Sizo	Valuo	Volatility
Linivorso: MS		1-Stat	Effect	T-Stat	Effect	Tielu	Womentum	Size	Value	Volatility
REG8 TEA	5.48	2 73	1 31	1 72	6 79	0.12	-0.91	0.95	1 21	-0.70
REG8 TE6	6 94	2.75	0.78	1.72	7 72	0.12	-1.18	1.31	1.21	-0.70
REG8 TE8	7.96	2.75	0.20	1.71	8.26	-0.04	_0.92	1.01	2.25	-2 77
REGO_TEO	7.50	2.10	0.23	1.75	0.20	-0.04	-0.32	1.40	2.20	-2.11
REG9 TE4	5.38	2.61	2.35	2.80	7.73	0.37	-0.20	0.84	1.24	-0.49
REG9 TE6	5.49	2.13	2.60	2.93	8.09	0.36	-0.21	1.20	1.89	-1.62
REG9_TE8	5.52	1.87	2.57	2.80	8.09	0.31	-0.01	1.31	2.39	-2.36
REG10_TE4	3.07	1.65	3.93	3.62	7.00	0.46	0.56	0.74	1.12	-0.31
REG10_TE6	3.03	1.49	5.04	3.66	8.08	0.54	0.90	1.04	1.65	-1.31
REG10_TE8	2.95	1.37	5.72	3.47	8.67	0.57	1.17	1.03	1.89	-1.64
EP_TE4	7.32	3.70	1.75	2.34	9.07	0.58	0.91	0.08	-0.44	-0.22
EP_TE6	8.78	3.68	1.03	2.04	9.81	0.68	0.88	0.07	-0.23	-0.37
EP_TE8	9.78	3.71	1.31	2.22	11.09	0.64	0.72	0.12	-0.05	-0.49
	=		4.00				0.07	0.40	4 = 0	
CTEF_TE4	5.90	3.35	4.02	3.55	9.92	0.76	0.67	-0.13	1.78	0.30
CTEF_TE6	6.56	3.33	4.79	3.29	11.34	0.92	0.62	-0.03	2.55	0.44
CTEF_TE8	6.82	3.26	5.35	3.07	12.17	1.00	0.55	-0.10	3.07	0.61

Source: FactSet and Axioma. Past performance is not indicative of future returns.



Updated Guerard and Markowitz (2018) Tilts, 2003 -11/2018

Mean-Variance Anomalies Portfolios

Robust Regression Models with Tukey OIF99%

Time Period: 12/2002 -11/2018

		Risk					Risk Factor			
	Risk Stock	Stock Specific	Risk	Risk Factors	Risk		Returns Medium-			
	Specific	Effect	Factors	Effect	Total	Earnings	Term			
Portfolios	Effect	T-Stat	Effect	T-Stat	Effect	Yield	Momentum	Size	Value	Volatility
Universe: MS										
REG8_TE4	3.99	2.38	1.79	2.11	5.78	0.25	-0.85	0.61	1.61	0.18
REG8_TE6	3.30	1.64	2.32	2.17	5.63	0.13	-0.99	1.00	2.46	-0.37
REG8_TE8	3.37	1.36	2.59	2.27	5.96	0.00	-0.78	1.20	2.84	-0.74
REG9_TE4	3.45	2.20	3.28	3.60	6.73	0.43	-0.19	0.49	1.69	0.27
REG9_TE6	2.62	1.54	4.37	3.49	6.99	0.41	-0.09	0.82	2.57	-0.23
REG9_TE8	3.40	1.73	5.09	3.31	8.50	0.38	0.25	1.04	3.21	-0.62
REG10_TE4	2.25	1.58	4.06	4.24	6.31	0.44	0.53	0.43	1.68	0.21
REG10_TE6	1.33	1.07	5.63	4.17	6.96	0.41	0.93	0.73	2.60	-0.30
REG10_TE8	0.30	0.59	6.34	3.68	6.64	0.39	1.32	0.87	3.16	-0.61
EP_TE4	2.06	1.28	2.66	3.21	4.72	0.52	-0.71	0.61	1.40	0.36
EP_TE6	3.85	1.98	2.96	3.06	6.81	0.63	-0.71	0.81	1.92	0.02
EP_TE8	3.20	2.16	3.84	4.42	7.04	0.63	1.51	0.30	0.47	-0.06
CTEF_TE4	3.67	2.13	4.67	4.02	8.34	0.90	2.13	0.49	0.73	-0.70
CTEF_TE6	3.67	2.13	4.67	4.02	8.34	0.90	2.13	0.49	0.73	-0.70
CTEF_TE8	3.54	2.18	5.76	3.64	9.30	0.87	2.69	0.62	0.93	-1.37

Source: FactSet and Axioma. Past performance is not indicative of future returns.



Model: Donut_EM Period: 2002-12-31 to 2018-07-31 (Monthly)

	Portfolio	Active			Spee	cific	Momentum		
	Return	Return	IR	T-Stat	Return	T-Stat	Return	Exposure	T-Stat
DONUT_EM_Proprietary Model	19.73%	7.94%	1.37	5.40	2.08%	2.13	1.85%	0.40	5.92
DONUT_EMProprietary Model_Group	19.27%	7.48%	1.28	5.06	1.85%	1.86	1.82%	0.40	5.72
DONUT_EM_E'	18.56%	6.77%	1.15	4.54	2.39%	2.24	1.04%	0.17	8.13
DONUT_EM_E'_group	18.03%	6.24%	1.06	4.20	2.07%	1.90	1.00%	0.17	7.76

	Value			Growth			Profitability	,	Tracking Err	Risk Model
Return	Exposure	T-Stat	Return	Exposure	T-Stat	Return	Exposure	T-Stat		
0.19%	0.10	2.82	0.11%	-0.07	2.76	0.51%	0.18	6.22	5.81%	WW4AxiomaMH
0.19%	0.10	2.71	0.11%	-0.08	2.69	0.47%	0.16	5.80	5.83%	WW4AxiomaMH
0.43%	0.22	4.05	0.10%	0.00	3.42	0.53%	0.20	4.57	5.89%	WW4AxiomaMH
0.36%	0.21	3.34	0.08%	0.01	3.05	0.52%	0.19	4.65	5.86%	WW4AxiomaMH

Source: FactSet and Axioma. Past performance is not indicative of future returns.



Disclaimer

All information contained herein is believed to be acquired from reliable sources but accuracy cannot be guaranteed. This presentation is for informational purposes only, was prepared for academics and financially sophisticated and institutional audiences, and is not intended to represent specific financial services or recommendations for any targeted investment purposes. McKinley Capital Management, LLC ("McKinley Capital") is a registered investment adviser under the Securities and Exchange Commission Investment Advisers Act of 1940. This material may contain confidential and/or proprietary information and may only be relied upon for this report. The data is unaudited and may not correspond to calculated performance for any other client or investor in the stated discipline. Neither Mr. Guerard nor McKinley Capital makes any representations or warranties as to the appropriateness or merit of this analysis for individual use. Investors must seek individualized professional financial advice before investing.

Investments and commentary were based on information available at the time and are subject to change without notice. Any references to specific indexes are for informational purposes only, may or may not have been owned by McKinley Capital in the past, may or may not be owned by McKinley Capital in the future and may or may not be profitable. No one security is profitable all the time and there is always the possibility of selling it at a loss. This is not an offer to purchase or sell any security or service, is not reflective of composite or individual portfolio ownership and may not be relied upon for investment purposes. Past performance is not indicative of future returns.

All returns are gross of investment management fees, broker commissions, taxes, and all other fees, costs and expenses associated with client account trading and custodial services, and therefore individual returns may be materially negatively affected. Returns do include the reinvestment of gains, dividends and other income. International investing involves special risks including greater economic, political, currency fluctuation and accounting differences risks. McKinley Capital's proprietary investment process considers additional factors such as additional guidelines, restrictions, weightings, allocations, market conditions and thus returns may at times materially differ from the stated benchmark.

Charts, graphs and other visual presentations and text information are provided for illustrative purposes, derived from internal, proprietary, and/or service vendor technology sources and/or may have been extracted from other firm data bases. As a result, the tabulation of certain reports may not precisely match other published data. Certain data may have originated from various third-party, and/or sources including but not limited to Bloomberg, FactSet, Clarifi, MSCI/Barra, Russell, FTSE, broker research, and/or other systems and programs. The authors and/or their employers may use and/or rely on specific index names, other financial data and certain analysis without the infringement of copyright materials. However, recipients of this information may not assume those same rights are transferrable. With regards to any materials accredited to MSCI/Barra. Neither MSCI nor any other party involved in or related to compiling, computing or creating the MSCI data makes any express or implied warranties or representations with respect to such data (or the results to be obtained by the use thereof), and all such parties hereby expressly disclaim all warranties of originality, accuracy, completeness, merchantability or fitness for a particular purpose with respect to any of such data. Without limiting any of the foregoing, in no event shall MSCI, any of its affiliates or any third party involved in or related to compiling, computing or creating the data have any liability for any direct, indirect, special, punitive, consequential or any other damages (including lost profits) even if notified of the possibility of such damages. No further distribution or dissemination of the MSCI data is permitted without MSCI's express written consent.

Please refer to the specific service provider's website for complete details on all indices. McKinley Capital makes no representation or endorsement concerning the accuracy or proprietary of information received from any other third party. Future investments may be made under different economic conditions, in different securities and using different investment strategies. International investing also carries additional risks and/or costs including but not limited to, political, economic, financial market, currency exchange, liquidity, accounting, and trading capability risks. To receive a copy of the McKinley Capital Form ADV please contact the firm at 3800 Centerpoint Drive, Suite 1100, Anchorage, Alaska 99503, 1.907.563.4488 or visit the firm's website at www.mckinleycapital.com. All information is believed to be correct but accuracy cannot be guaranteed.

