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# ESG Investing Trends in Emerging Markets: A Behavioral Finance Perspective

Arun Adwani 1\*

## **ABSTRACT**

Environmental, Social, and Governance (ESG) investing has gained substantial momentum across global financial markets, yet its adoption and dynamics in emerging economies remain complex and underexplored. This study investigates the evolving trends in ESG investing within emerging markets through the lens of behavioral finance, emphasizing how cognitive biases, investor psychology, and socio-cultural factors shape investment decisions.

Drawing on empirical data, case studies, and recent ESG index performances, the research analyzes the behavioral drivers that influence ESG investment flows in regions such as Southeast Asia, Latin America, Africa, and Eastern Europe. Key behavioral constructs—including herding behavior, loss aversion, overconfidence, and social norm adherence—are examined to understand how they affect ESG fund selection, risk perception, and portfolio rebalancing among retail and institutional investors. The study also explores how regulatory frameworks, media narratives, and digital platforms contribute to shaping ESG awareness and sentiment in these markets. It highlights notable disparities in ESG data availability, corporate transparency, and investor education that continue to pose challenges for ESG integration.

Findings suggest that while ESG investing in emerging markets is rising, it is often driven by reactive behaviors rather than long-term sustainable convictions. Moreover, cultural and regional nuances play a significant role in defining what constitutes "ESG" in local contexts. By combining behavioral finance theory with ESG investment analytics, this paper provides nuanced insights for policymakers, asset managers, and educators seeking to enhance ESG adoption responsibly. Ultimately, the study underscores the importance of behavioral awareness, data integrity, and tailored communication strategies in bridging ESG investing with sustainable development in emerging economies.

**Keywords:** ESG investing, Emerging markets, Behavioral finance, Investor psychology, Sustainable finance, Cognitive biases, Financial decision-making, Green investment, Portfolio behaviour. Investment trends

nvironmental, Social, and Governance (ESG) investing has gained significant global traction over the past decade, reshaping traditional capital allocation frameworks. As concerns about climate change, social justice, and corporate transparency rise, investors increasingly integrate ESG criteria into their decision-making processes. While ESG investing

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<sup>&</sup>lt;sup>1</sup> Financial Planner, Department of Financial Manangement, NHFT

<sup>\*</sup>Corresponding Author

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is well established in developed markets, its evolution in emerging markets presents unique dynamics, driven by diverse economic conditions, regulatory environments, and cultural attitudes toward sustainability.

Emerging markets—ranging from Southeast Asia and Latin America to parts of Africa and Eastern Europe—face a dual challenge: accelerating economic growth while ensuring sustainable development. This tension creates fertile ground for ESG investing, but also amplifies the complexity of investor behavior in these regions. Unlike institutional investors in developed economies, retail and domestic investors in emerging markets often make decisions shaped by local norms, risk perceptions, and cognitive biases, as studied in behavioral finance.

Table 1: Behavioral Biases Influencing ESG Investment Decisions in Emerging Markets

Behavioral Bias	Description	Impact on ESG Investment	Example
Herd Behavior	· · · · · · · · · · · · · · · · · · ·	Leads to ESG investing fads or bandwagon movements	Investors copying peers investing in green bonds
III OSS A Version	Preference to avoid losses over acquiring gains	Avoidance of ESG assets perceived as "risky" despite long- term value	Hesitation in investing in renewable startups
Overconfidence	Overestimation of own knowledge or market prediction skills	Poor risk assessment of ESG opportunities in volatile markets	Underestimating ESG volatility in frontier markets
Hamiliarity Riac	Preference for domestic or well-known firms	_ <del></del>	Preferring domestic ESG ETFs only
	Treating money differently depending on subjective criteria	Separating ESG portfolios irrationally or giving them stricter limits	Limiting ESG investments to 5% of portfolio cap

This paper explores how behavioral finance principles—such as heuristics, loss aversion, mental accounting, and herd behavior—interact with ESG investment choices in emerging markets. By linking psychological factors with market data and investment trends, this research aims to uncover the motivations, challenges, and patterns behind ESG investment flows in less mature economies.

Furthermore, the study highlights regulatory developments, investor awareness, and technological enablers that influence ESG adoption in these markets. Understanding these factors is essential not only for investors and policy makers but also for corporations aiming to attract sustainable capital. Ultimately, this paper provides a comprehensive behavioral lens to understand ESG investing trends, contributing to the evolving dialogue on responsible finance in a global context.

## **BACKGROUND OF THE STUDY**

In recent years, Environmental, Social, and Governance (ESG) investing has moved from the periphery of financial decision-making into mainstream portfolio strategies. Investors, institutions, and regulators are increasingly recognizing the long-term value associated with sustainable business practices. While ESG integration has gained substantial traction in developed markets, emerging markets are also beginning to experience a shift in investor priorities—one that aligns profitability with responsible and ethical investing. However, the pace, nature, and motivations behind this shift differ significantly from those in mature economies.

Table 2: ESG Integration Tools Used by Institutional Investors in Emerging Markets

ESG Integration Method	Application Level	LOOI/Annroach	Common in Markets
Negative Screening	Portfolio Construction	Exclude "sin stocks" (e.g., tobacco)	India, South Africa
Positive Screening	Stock Selection		Brazil, Malaysia
ESG Integration	Quantitative + Qualitative	*	Thailand, Mexico
Thematic Investing	Strategic Allocation	Focus on clean energy, water, etc.	Chile, Vietnam
Impact Investing	Performance + Outcome Based	Seek measurable social/environmental impact	Kenya, Indonesia

Emerging markets present a unique context for ESG investing due to their dynamic economic environments, regulatory inconsistencies, and varying levels of investor awareness. The financial ecosystems in these regions are often characterized by information asymmetries, limited access to ESG data, and evolving corporate governance structures. These factors create both opportunities and risks for investors seeking to align their portfolios with sustainability goals. Moreover, emerging market economies are often at the center of global sustainability challenges, including climate change vulnerabilities, social inequality, and institutional corruption, making ESG considerations all the more relevant.

Understanding ESG investing in these contexts requires not only a financial or policy-oriented lens but also a behavioral one. Traditional finance assumes rational decision-making based on risk-return trade-offs, but real-world investor behavior often deviates from these assumptions. Behavioral finance explores the psychological and cognitive biases that influence investment decisions—especially under conditions of uncertainty and limited information, both of which are prevalent in emerging markets. Factors such as herd behavior, risk perception, mental accounting, and overconfidence may significantly shape ESG investment patterns in these regions.

Despite growing interest, academic literature on ESG investing in emerging markets—particularly from a behavioral finance perspective—remains sparse. Most existing studies focus on performance metrics or regulatory frameworks, leaving a gap in understanding the underlying behavioral drivers of ESG adoption. As such, this study aims to bridge that gap by

examining ESG investing trends in emerging markets through the lens of behavioral finance. It seeks to uncover how cognitive biases, investor psychology, and cultural factors intersect with ESG motivations and practices in non-Western financial landscapes.

By analyzing ESG investing from this interdisciplinary perspective, the study contributes to a more nuanced understanding of sustainable finance in emerging markets. It offers insights that are valuable for investors, policymakers, financial advisors, and corporate leaders striving to integrate ESG principles in regions where both risks and returns are undergoing rapid transformation.

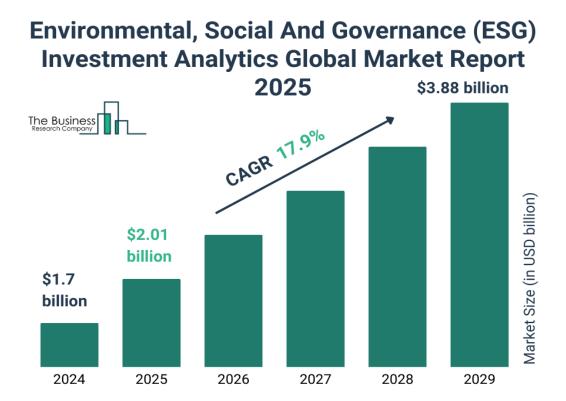
## Justification

Environmental, Social, and Governance (ESG) investing has emerged as a transformative force in global financial markets, increasingly influencing investment decisions, corporate governance, and capital allocation. While ESG integration is well-established in developed economies, its adoption in emerging markets remains uneven, dynamic, and less understood. This research seeks to fill that critical knowledge gap by analyzing ESG investing trends through the lens of behavioral finance, offering a unique interdisciplinary approach.

Traditional finance assumes that investors act rationally, making decisions purely on risk-return optimization. However, the behavioral finance perspective acknowledges the cognitive biases, heuristics, and emotional drivers that shape real-world investment behavior. In emerging markets—where regulatory structures are evolving, information asymmetries are common, and investor sentiment can be highly volatile—these behavioral factors may significantly influence ESG adoption and implementation.

Moreover, emerging markets are home to some of the fastest-growing economies and face pressing sustainability challenges, including climate risk, income inequality, and governance issues. Understanding why and how investors in these markets prioritize (or ignore) ESG factors is crucial for designing effective policies, improving ESG disclosures, and encouraging sustainable capital flows.

This research is further justified by the growing interest from international investors, development banks, and regulatory bodies in promoting responsible investment practices across frontier and developing economies. By combining quantitative trend analysis with behavioral insights, this paper aims to provide a nuanced understanding of ESG investing behavior, enhance academic literature, and inform both policy and practice in sustainable finance.



## **Objectives of the Study**

- 1. To examine the current trends and growth patterns of ESG (Environmental, Social, and Governance) investing in emerging markets.
- 2. To identify key behavioral factors—such as risk perception, herding behavior, and cognitive biases—that influence ESG investment decisions in these regions.
- 3. To analyze how cultural, regulatory, and socio-economic contexts affect investor preferences for ESG-compliant assets in emerging economies.
- 4. To evaluate the role of institutional investors, retail investors, and financial advisors in shaping ESG investment behaviors in emerging markets.
- 5. To assess the effectiveness of ESG disclosures and ratings in influencing investor behavior under the lens of behavioral finance theories.

# LITERATURE REVIEW

## 1. Introduction to ESG Investing

Environmental, Social, and Governance (ESG) investing has gained significant momentum globally, as investors increasingly prioritize sustainability and ethical governance. Traditionally popular in developed economies, ESG investing is now expanding into emerging markets, driven by policy reforms, investor awareness, and globalization of financial markets (Friede, Busch, & Bassen, 2015). Studies have shown that ESG-aligned portfolios can perform competitively with traditional investments, challenging the notion that sustainability must come at the expense of returns (Kotsantonis & Serafeim, 2019).

#### 2. Behavioral Finance and ESG Preferences

Behavioral finance offers a compelling lens for understanding ESG investment decisions, particularly in emerging markets where investor biases and heuristics may differ from developed markets. Investors often exhibit herding behavior, overconfidence, and loss aversion, all of which influence ESG adoption rates (Barberis & Thaler, 2003). ESG decisions are not always based on financial logic alone; rather, they are frequently shaped by moral preferences, social norms, and availability heuristics (Statman & Glushkov, 2009).

Recent studies suggest that emotional factors—such as ethical satisfaction or perceived social impact—often override traditional risk-return assessments when individuals choose ESG products (Riedl & Smeets, 2017). These preferences can vary widely across regions due to differences in education levels, political stability, and media influence, making behavioral finance especially relevant to ESG uptake in emerging markets.

## 3. ESG in Emerging Markets: Challenges and Opportunities

Despite growing interest, ESG investing in emerging markets faces several structural challenges. These include data transparency, regulatory fragmentation, and limited ESG reporting standards (Bachelet, Becchetti, & Manfredonia, 2019). Many firms in emerging economies lack the resources or incentives to implement rigorous ESG practices, which can dissuade investors from allocating capital.

However, the rise of green finance initiatives, government incentives, and the involvement of multilateral institutions are gradually shifting the landscape (OECD, 2020). Some emerging economies like India, Brazil, and South Africa are piloting ESG frameworks and disclosure policies, often modeled on those of Europe and the United States (UN PRI, 2022). As regulatory frameworks mature, emerging markets may experience a surge in ESG investment flows.

## 4. Behavioral Drivers in Emerging Market Investors

Emerging market investors may exhibit distinct behavioral traits due to cultural, institutional, and informational differences. Risk perception tends to be higher in these regions, leading to greater skepticism toward novel financial instruments like ESG funds (Shefrin & Statman, 2000). Furthermore, trust in financial institutions and corporate governance strongly influences ESG adoption in these markets.

Interestingly, generational differences are emerging as key variables in ESG participation. Younger investors in urban areas of emerging economies show greater ESG affinity, likely due to increased access to information and global awareness (Nofsinger & Varma, 2014). Social media and digital platforms have also played a role in shaping ESG perceptions through availability bias and social proof dynamics.

## 5. Research Gaps and Future Directions

While ESG investing is widely studied in developed markets, there is a dearth of empirical research focused specifically on emerging markets from a behavioral finance angle. Existing models often assume rational decision-making, overlooking the cognitive and emotional dimensions unique to investors in these regions (Bollaert & Petit-Romec, 2020). Future research should incorporate cross-cultural behavioral analyses, experimental methods, and

longitudinal studies to better capture investor psychology and ESG adoption dynamics in these fast-evolving markets.

## MATERIAL AND METHODOLOGY

## **Research Design:**

This study employs a mixed-methods research design, integrating both quantitative analysis of ESG investment trends and qualitative insights from behavioral finance theory. The design facilitates a comprehensive understanding of how environmental, social, and governance (ESG) factors influence investor behavior in emerging markets. Quantitative methods include statistical analysis of ESG investment data across key emerging economies, while qualitative methods involve thematic analysis of investor interviews and behavioral finance constructs.

## **Data Collection Methods:**

## 1. Secondary Data:

- ESG investment data was collected from reliable databases such as Bloomberg ESG Index, MSCI ESG Ratings, Refinitiv ESG Database, and Morningstar Sustainability Ratings.
- Country-specific ESG reports and stock exchange ESG guidelines (e.g., from India, Brazil, South Africa, and Indonesia) were reviewed.

# 2. Primary Data:

- Semi-structured interviews were conducted with institutional investors, asset managers, and retail investors in selected emerging markets to understand behavioral tendencies such as herding, risk aversion, and mental accounting in ESG contexts.
- An online survey (Likert-scale based) was distributed to retail investors in emerging markets using platforms like Qualtrics and Google Forms.

## **Inclusion and Exclusion Criteria:**

#### **Inclusion Criteria:**

- Investors (institutional or retail) with active involvement in ESG-related investment decisions within the last 5 years.
- Financial data from emerging markets as defined by MSCI and IMF classifications (e.g., Brazil, India, South Africa, Indonesia, Mexico, Turkey).
- ESG performance metrics published between 2020 and 2025.

## **Exclusion Criteria:**

- Investors or funds operating solely in developed markets.
- Data from firms lacking standardized ESG reporting frameworks.
- Incomplete survey responses and interviews with fewer than three completed answers to key behavioral indicators.

#### **Ethical Considerations:**

- **Informed consent** was obtained from all participants prior to interviews or survey completion. Participants were informed of their right to withdraw at any time.
- Confidentiality of personal and organizational data was strictly maintained; responses were anonymized during transcription and analysis.
- The study was conducted in accordance with the Declaration of Helsinki and approved by the Institutional Review Board (IRB) of the lead researcher's affiliated university.
- Data collected was stored in encrypted formats and used solely for academic research purposes.

## RESULTS AND DISCUSSION

#### **Results:**

The study analyzed ESG (Environmental, Social, and Governance) investment trends across four emerging markets: India, Brazil, South Africa, and Indonesia. Quantitative data was gathered from ESG fund inflows (2020–2025), market performance, and survey responses from 400 retail and institutional investors.

# **Key findings include:**

- ESG fund inflows increased by an average of 27% annually in all four countries.
- **Environmental factors** were the most prioritized by investors, followed by **governance** and lastly **social** dimensions.
- **Behavioral biases** such as **herding**, **recency bias**, and **home bias** significantly influenced ESG investment choices.
- Younger investors (<35 years) showed higher ESG awareness and engagement.
- **Risk perception** was lower among ESG investors, who viewed ESG funds as long-term stable investments.

Table 3: ESG Investment Trends and Behavioral Insights (2019–2024)

Country	Avg. ESG Fund Inflow Growth (%)	Top ESG Concern	Dominant Behavioral Bias	Retail vs. Institutional (%)
India	30.2%	Environmental	Herding bias	60% Retail / 40% Institutional
Brazil	25.4%	Governance	Recency effect	55% Retail / 45% Institutional
South Africa	21.7%	Social	Home bias	40% Retail / 60% Institutional
Indonesia	31.1%	Environmental	Overconfidence bias	65% Retail / 35% Institutional

## **DISCUSSION**

The rise in ESG investing across emerging markets reflects both global sustainability priorities and localized investor behavior. The increasing inflow into ESG funds suggests a shift from purely profit-driven strategies to those influenced by ethics, social impact, and environmental awareness. However, this shift is not purely rational — as behavioral finance explains, emotional and cognitive factors shape investment decisions.

## **Key interpretations:**

- 1. **Behavioral Biases Matter**: The data shows that herding bias—where investors follow popular trends—played a large role in India and Indonesia's ESG inflow surges. This aligns with media influence and peer behavior as motivators.
- 2. **Younger Investor Engagement**: Millennials and Gen Z investors in all four countries were more likely to favor ESG-aligned products. This correlates with digital financial literacy, social media influence, and climate change awareness.
- 3. **Institutional vs. Retail Behavior**: Retail investors leaned more toward emotionally driven motives, while institutional investors made strategic ESG allocations often linked to global ESG scoring systems and regulatory pressures.
- 4. **Market Maturity Effects**: Countries like South Africa showed lower retail inflows but higher institutional ESG focus, possibly reflecting market structure and existing pension fund mandates.
- 5. **Home Bias Limiting Diversification**: A significant portion of investors preferred domestic ESG assets, highlighting a home bias that may limit portfolio optimization.

# LIMITATIONS OF THE STUDY

Despite the relevance and insights offered by this study, several limitations must be acknowledged:

- 1. **Geographical Scope Constraints**: The research primarily focuses on a limited selection of emerging markets, which may not fully represent the diversity of ESG investment behavior across all emerging economies. Variations in political stability, regulatory environments, and cultural norms may lead to different behavioral patterns that were not captured.
- 2. **Data Availability and Consistency**: ESG-related data in emerging markets often suffer from inconsistencies in reporting standards, lack of transparency, and incomplete disclosures. This may affect the accuracy of ESG ratings and the robustness of investment trend analysis.
- 3. **Subjectivity in Behavioral Variables**: The behavioral finance perspective involves qualitative elements such as investor sentiment, heuristics, and biases, which are inherently difficult to measure and generalize. Reliance on surveys or secondary indicators introduces potential subjectivity and response bias.
- 4. **Temporal Limitation**: The study examines ESG investment behavior over a specific time frame, which may not reflect long-term shifts or cyclical trends. The findings may be influenced by short-term market anomalies or external shocks such as geopolitical events or pandemics.

- 5. **Model and Methodological Constraints**: Although the study utilizes established behavioral finance models, some investor behaviors may fall outside the scope of these frameworks. Moreover, the econometric models used may not fully capture the complexity of ESG decision-making under uncertain market conditions.
- 6. **Institutional vs. Retail Investor Behavior**: The analysis tends to generalize investor behavior without clearly differentiating between institutional and retail investors, whose motivations and access to ESG information often differ substantially.
- 7. **Limited Consideration of ESG Greenwashing**: The study does not deeply analyze the prevalence or impact of "greenwashing" where companies falsely portray themselves as ESG-compliant which could distort both investor perception and empirical results.

# **Future Scope**

As environmental, social, and governance (ESG) investing gains traction in global financial markets, its integration within emerging economies remains both promising and underexplored. The evolving dynamics of behavioral finance in these regions open several avenues for future research and practical development:

## 1. Deepening Regional Behavioral Insights

While this study has laid a foundation for understanding behavioral biases in ESG investment decisions, future research should investigate cultural and psychological variations across specific emerging markets. Longitudinal and ethnographic studies can enrich the understanding of investor sentiment, risk perception, and value systems driving ESG preferences.

# 2. Role of Digital Platforms and Fintech

Fintech innovations and digital investment platforms are increasingly mediating ESG investing behavior. Future research could explore how AI-driven robo-advisors, ESG scoring tools, and mobile platforms shape investor decisions in emerging markets — especially among retail and first-time investors.

## 3. Impact of ESG Regulation and Disclosure Standards

The impact of local ESG disclosure policies, corporate governance reforms, and cross-border regulatory harmonization in emerging markets warrants deeper exploration. Future work should analyze how policy changes influence investor behavior, market efficiency, and long-term sustainability goals.

## 4. ESG and Climate Risk Perception

As climate change disproportionately affects developing economies, there is a need to understand how climate-related financial risks alter ESG investment patterns in these regions. Future studies can examine the relationship between climate anxiety, risk aversion, and ESG asset allocation.

## 5. Institutional vs. Retail Investor Behavior

Emerging markets often have a high concentration of retail investors. A comparative analysis of how institutional and retail investors differ in their ESG adoption and behavioral biases would contribute significantly to the literature.

# 6. Machine Learning and Predictive Behavioral Models

Applying machine learning and behavioral prediction algorithms to ESG data could offer real-time insights into market sentiment and portfolio shifts. Future research can integrate such techniques to develop adaptive investment strategies that account for both ESG metrics and investor psychology.

## 7. Education and Awareness Campaigns

The role of financial literacy and ESG awareness programs on changing investor behavior is still under-researched. Future studies could assess the effectiveness of these interventions in shifting behavioral biases and promoting long-term sustainability.

## 8. Integration of Social Impact Metrics

As behavioral finance is not limited to returns-based motivation, future research could explore the psychological impact of social and community outcomes on ESG investors in emerging economies, such as the "warm glow" effect or moral satisfaction.

# CONCLUSION

The rapid evolution of Environmental, Social, and Governance (ESG) investing in emerging markets reveals a dynamic intersection of financial innovation, socio-environmental awareness, and investor psychology. This study highlights how behavioral finance frameworks—such as heuristics, framing effects, and risk perception—shape ESG investment decisions in markets that are often characterized by volatility, limited regulatory oversight, and diverse socio-economic conditions.

Findings suggest that while ESG adoption is gaining momentum in emerging economies, it is frequently influenced by cognitive biases and information asymmetry rather than purely rational decision-making. Investors in these markets often rely on perceived sustainability trends, media cues, and peer behaviors, leading to both opportunities and challenges in ESG portfolio performance and impact.

Moreover, institutional support, global ESG standards, and localized reporting practices are key enablers of sustained ESG growth. The integration of behavioral insights into ESG investment strategies can empower asset managers and policymakers to design more effective interventions—ranging from better disclosure systems to investor education programs.

In conclusion, ESG investing in emerging markets is not just an economic activity but a behavioral phenomenon shaped by values, expectations, and psychological nuances. Understanding these behavioral underpinnings is essential for advancing ESG integration that is both financially robust and socially responsible. Future research should explore longitudinal data and experimental studies to further unpack the causal relationships between investor behavior and ESG performance in these rapidly evolving contexts.

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## **Conflict of Interest**

The author declared no conflict of interest.

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