



IIA's Artificial Intelligence Auditing Framework

Fandhy Haristha S,

CIA, CRMA, CCSA, CISA, CISM, CRISC, CGEIT, GRCP, GRCA, CISSP, CEH, CEP-PM, QIA, COBIT5

Agenda



AI Introduction



AI in Real World



IIA AI Auditing Framework



Additional: Machine Learning for Auditing

Fraud is a global problem – Challenges Ahead

1

Enforcement spreads geographically

2

Societal action vs unenforced regulation

3

Automated & preventative compliance

4

Societies become increasingly cashless

5

Ethical & transparent businesses

1. \$1trillion is paid each year in bribery globally, and \$2.6 trillion is lost to corruption, (5% of the global GDP). [PwC report 2017](#)
2. More than one in three (36%) organisations experienced economic crime. [PwC report](#)
3. Only 50% of respondents globally are using specialist monitoring software to identify fraud risks. [EY global fraud survey 2016](#)

Artificial Intelligence in History



1996-1997



2011

2020-2021



AI is not new. The idea of AI dates back to 1950 when Alan Turing first proposed that a machine could communicate well enough to convince a human evaluator that it, too, was human.

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3 Vs of Big Data

Volume: The amount of data being created is vast compared to traditional data sources

Variety: Data comes from all types of formats. This can include data generated within an organization as well as data created from external sources, including publicly available data.

Velocity: Data is being generated extremely quickly and continuously.

Additional Vs

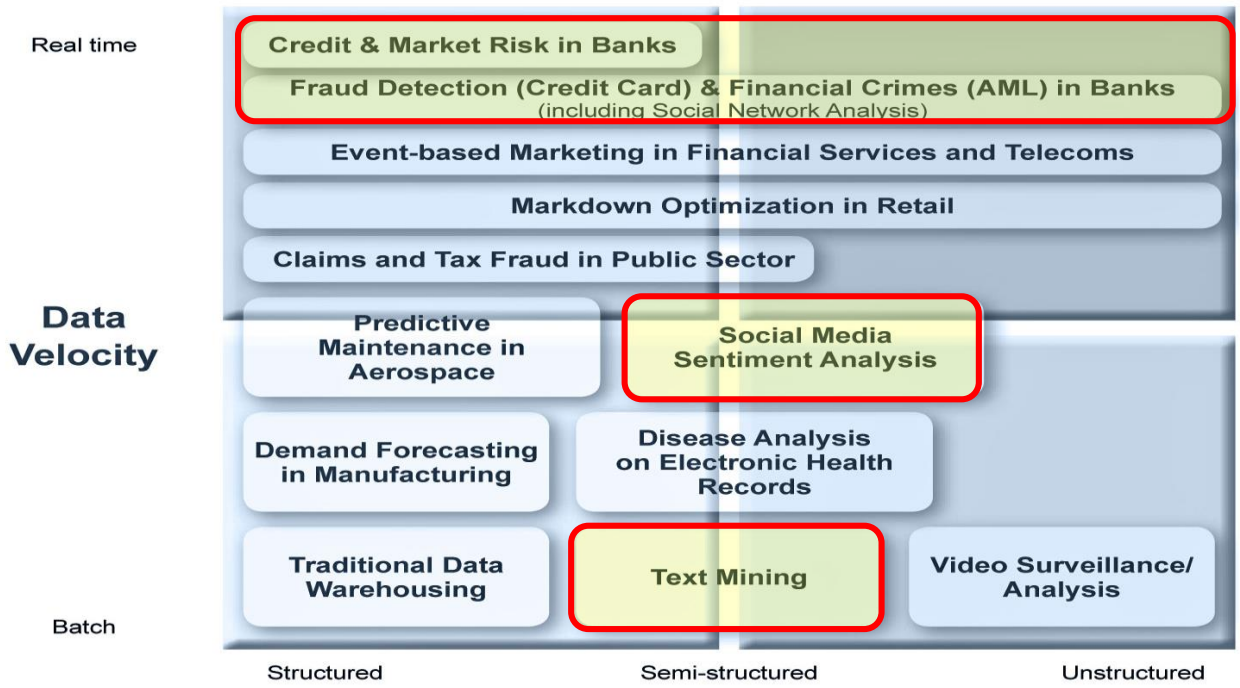
Veracity: Data must be able to be verified based on both accuracy and context.

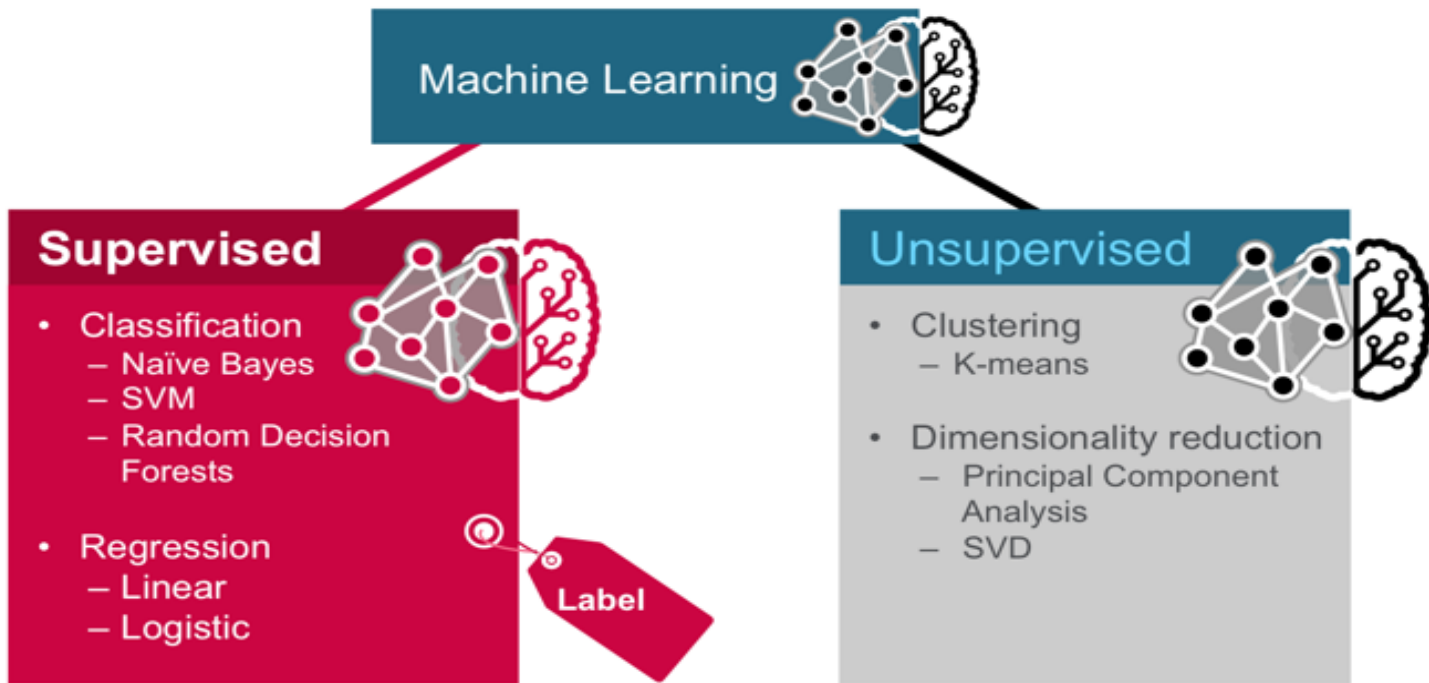
Variability: Big data is extremely variable and always changing.

Visualization: Analytic results from big data are often hard to interpret; therefore, translating vast amounts of data into readily presentable graphics and charts that are easy to understand is critical to end-user satisfaction and may highlight additional insights.

Value: Organizations, societies, and consumers can all benefit from big data. Value is generated when new insights are translated into actions that create positive outcomes.

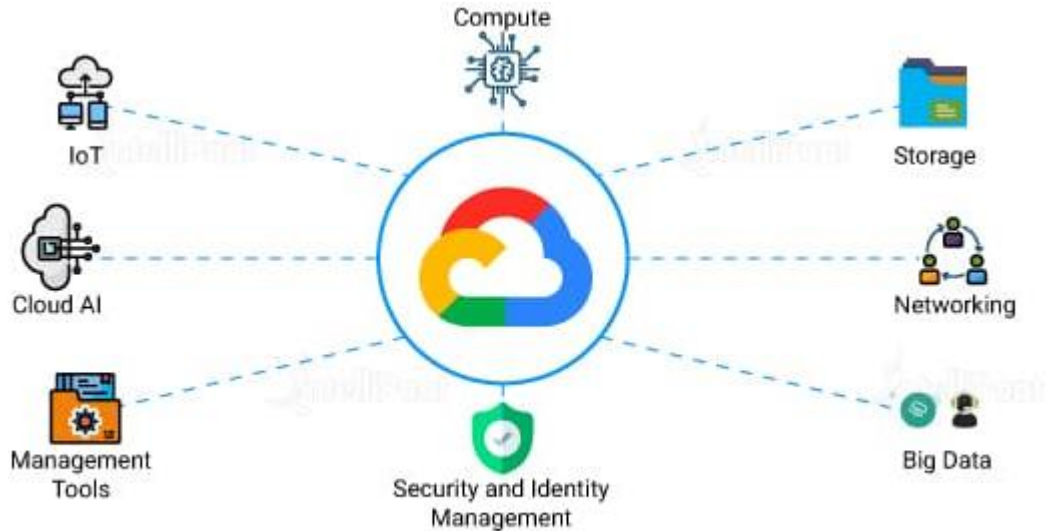
Potential Use Cases for Big Data Analytics



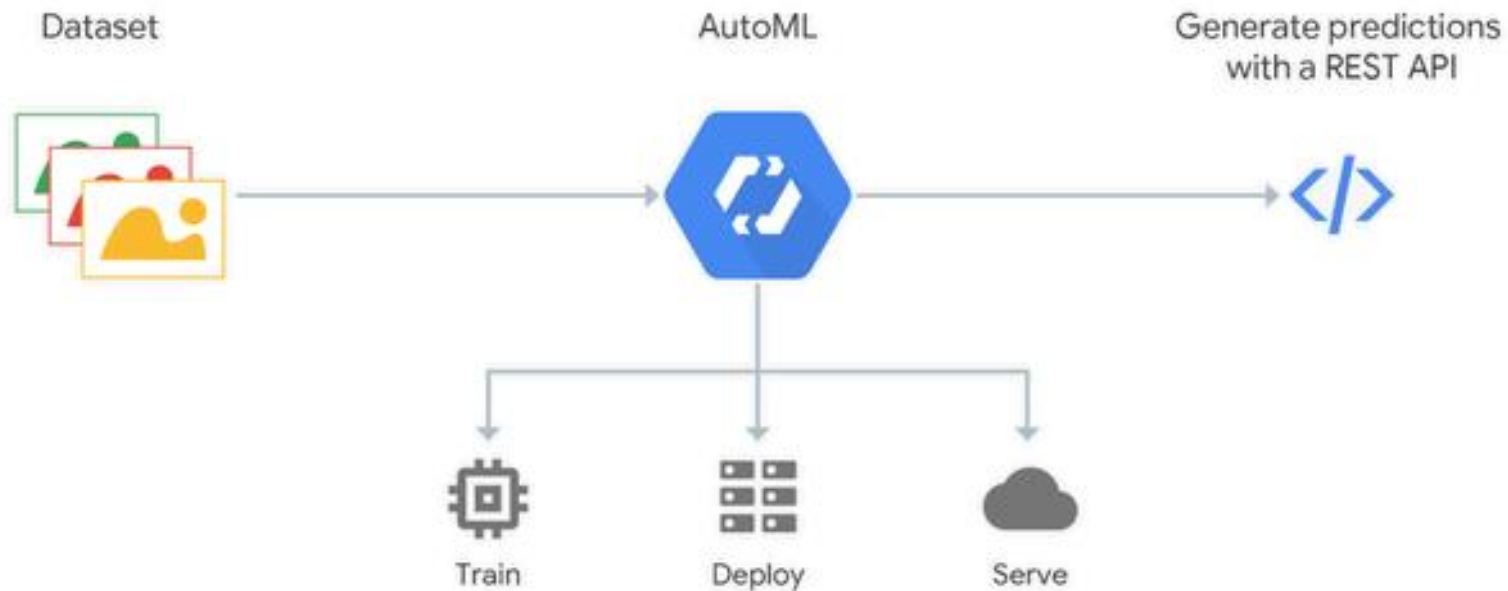




Google Cloud Platform



Google AutoML (Auto Machine Learning) memungkinkan kita melakukan analisa, train, dan permodelan atas berbasis cloud data/big data dalam melakukan aktifitas tertentu sehingga berdasarkan karakteristik pada data tersebut kita bisa membuat prediksi

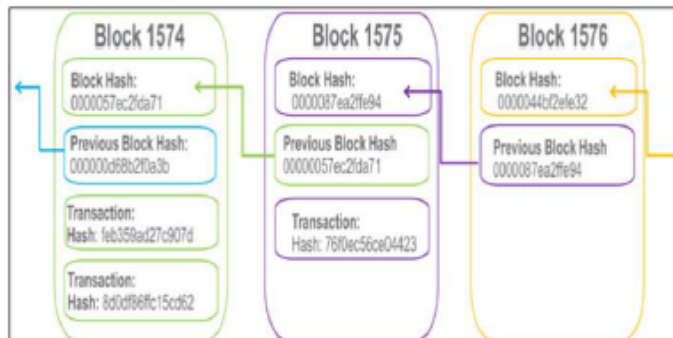


What is Blockchain and its Underlying Architecture?

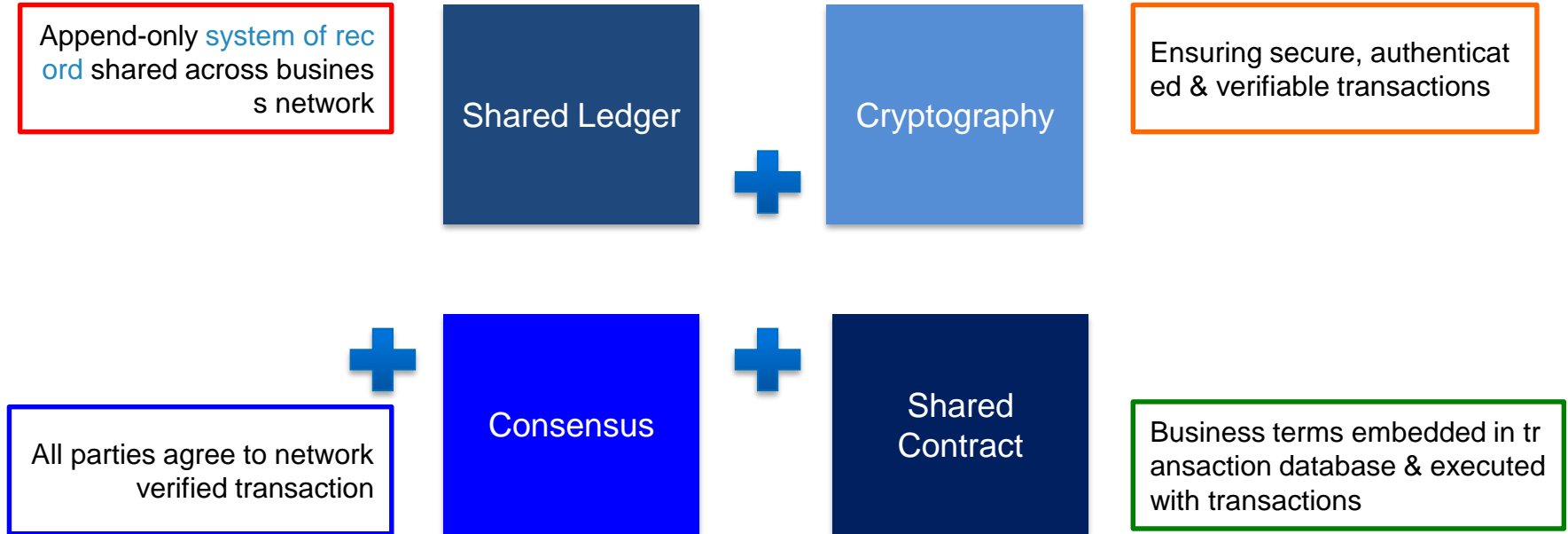
Blockchain is an algorithm and a distributed data structure for managing data without a central administrator among people who know nothing about one another. Originally designed for the crypto-currency Bitcoin, the blockchain architecture was driven by a rejection of money and bank-controlled payments.



- Blockchain owes its name to the way it stores transaction data — in blocks that are linked together to form a chain (**Shown in Figure**). As the number of transactions grows, so does the blockchain. Blocks record and confirm the time and sequence of transactions, which are then logged into the blockchain, within a discrete network governed by rules agreed on by the network participants.
- Each block contains a hash (a digital fingerprint or unique identifier), timestamped batches of recent valid transactions, and the hash of the previous block.
- The previous block hash links the blocks together and prevents any block from being altered or a block being inserted between two existing blocks. In this way, each subsequent block strengthens the verification of the previous block and hence the entire blockchain.
- The method renders the blockchain tamper-evident, lending to the key attribute of immutability (explained in the next slide).



Blockchain in a nutshell



Broader participation, lower cost, increased efficiency

- Improving quality of Audit
- Frequency of Audit
- Entire population of data instead of a random sample
- Avoiding misstatement
- Faster audit
- Ability for Real-time fraud monitoring and detection
- Deep learning focused on finding anomalies



The image shows a screenshot of a World Economic Forum article. The article title is "5 million jobs to be lost by 2020". Below the title is a photograph of a robotic arm. Overlaid on the article is a white box with the "Ia INTERNAL AUDITOR" logo and a "MENU" section. The menu lists 10 skills: Critical Thinking, Creativity, People Management, Coordinating with Others, Emotional Intelligence, Judgment and Decision Making, Service Orientation, Negotiation, Cognitive Flexibility, Coordinating with Others, People Management, Critical Thinking, Negotiation, Quality Control, Service Orientation, Judgment and Decision Making, Active Listening, and Creativity. At the bottom of the overlay, there are icons for a network, a person with a plus sign, and a group of people with a lightbulb. The source is cited as "Source: Future of Jobs Report, World Economic Forum".

WORLD ECONOMIC FORUM

Agenda Initiatives Reports Events About

Global Agenda Davos 2016 Workforce and Employment

5 million jobs to be lost by 2020



Ia INTERNAL AUDITOR

MENU

Internal Auditing and the Fourth Industrial Revolution

Richard Chambers July 31, 2017
1 Comment

2. Critical Thinking
3. Creativity
4. People Management
5. Coordinating with Others
6. Emotional Intelligence
7. Judgment and Decision Making
8. Service Orientation
9. Negotiation
10. Cognitive Flexibility
2. Coordinating with Others
3. People Management
4. Critical Thinking
5. Negotiation
6. Quality Control
7. Service Orientation
8. Judgment and Decision Making
9. Active Listening
10. Creativity

Source: Future of Jobs Report, World Economic Forum

Key Characteristics of Blockchain

Consensus

For a transaction to be valid, all participants must agree on its validity.

Provenance

Participants know where the asset came from and how its ownership has changed over time.



Immutability

No participant can tamper with a transaction after it's been recorded to the ledger. If a transaction is in error, a new transaction must be used to reverse the error, and both transactions are then visible.

Finality

A single, shared ledger provides one place to go to determine the ownership of an asset or the completion of a transaction.

Blockchain adoption and maturity

2015

Exploration & Investment

- Initial capability & use case assessments
- Early adoption likely for internal reconciliation

2016-2017

Early Adoption

- Leading-edge banks see the value of blockchain and begin deployments for asset classes that are bilaterally traded and/or have no central clearing authority
- Regulatory certainty drives adoption for external uses
- Regulatory authorities realize the benefits of blockchain for auditing and compliance, and rule-making begins

2018-2024

Growth

- Banks begin to see the benefits accorded to early adopters and – combined with regulatory guidance and certainty – the network effect takes hold
- New service providers and models emerge
- Deployments go viral across numerous asset classes
- New products and services are created; incumbent processes and services are discarded

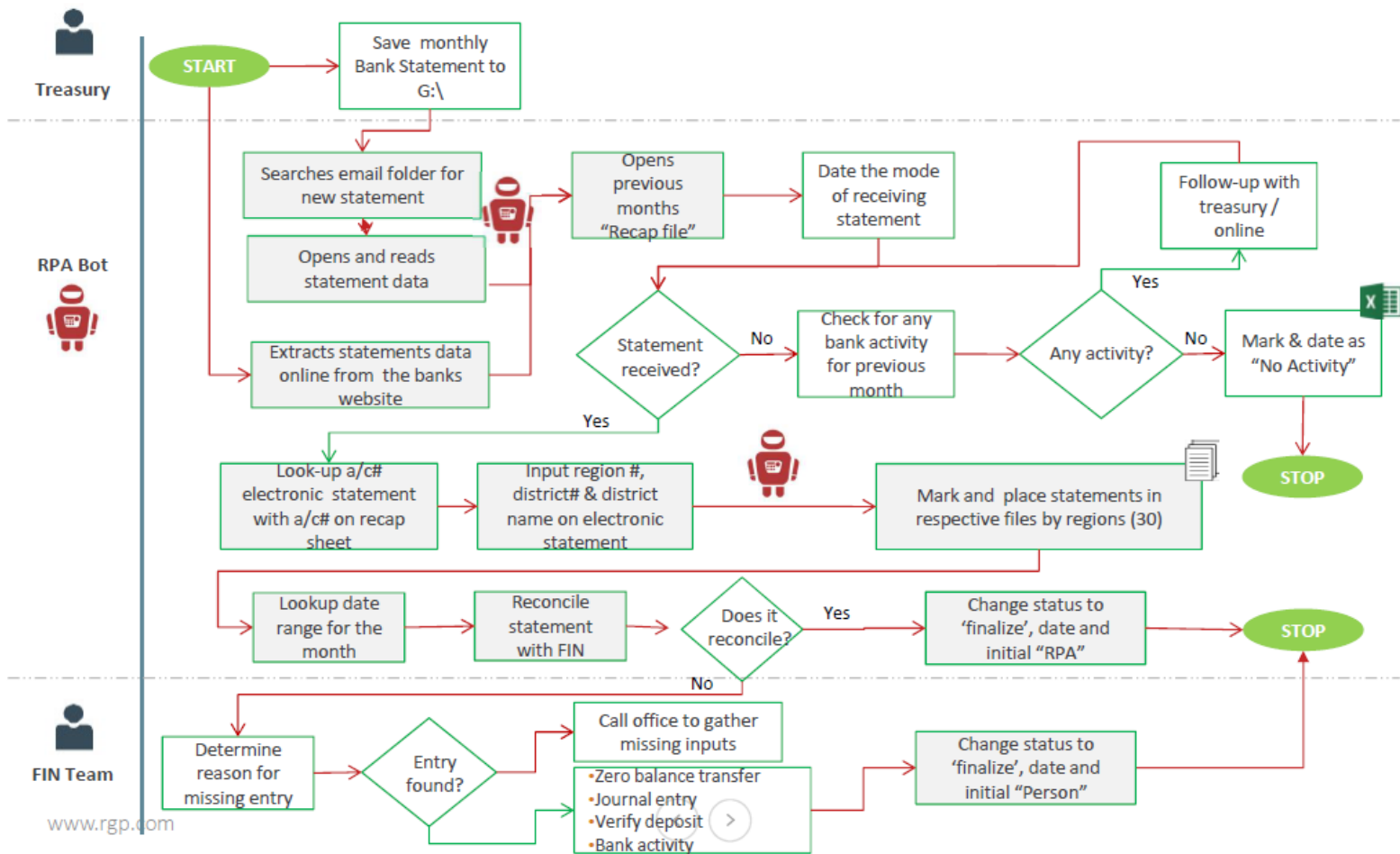
2025

Maturity

- Blockchain adoption is considered mainstream and integral to the capital markets ecosystem

- RPA is not a **physical “robot”** but a **configurable software**, that **sits on top of a company’s existing IT infrastructure**, pulling data, performing algorithms, and creating reports.
- The “robot” is configured to complete the same process steps, follow the **business rules**, and **use the same systems that a human does today**.
- RPA makes the most significant impact on **manual work processes**, that are **repetitive and recurring**, and often have **high human error rates**.
- A single “robot” can be configured to performed a variety of processes enabling **multi-use** robots, and **variability as your business needs change**.
- The initial implementation of RPA can happen in weeks and typically delivers an **ROI of greater than 5:1**, often recouping the investment in the first year.

Example of Bank Reconciliation using RPA



www.rgp.com

Agenda



AI Introduction



AI in Real World

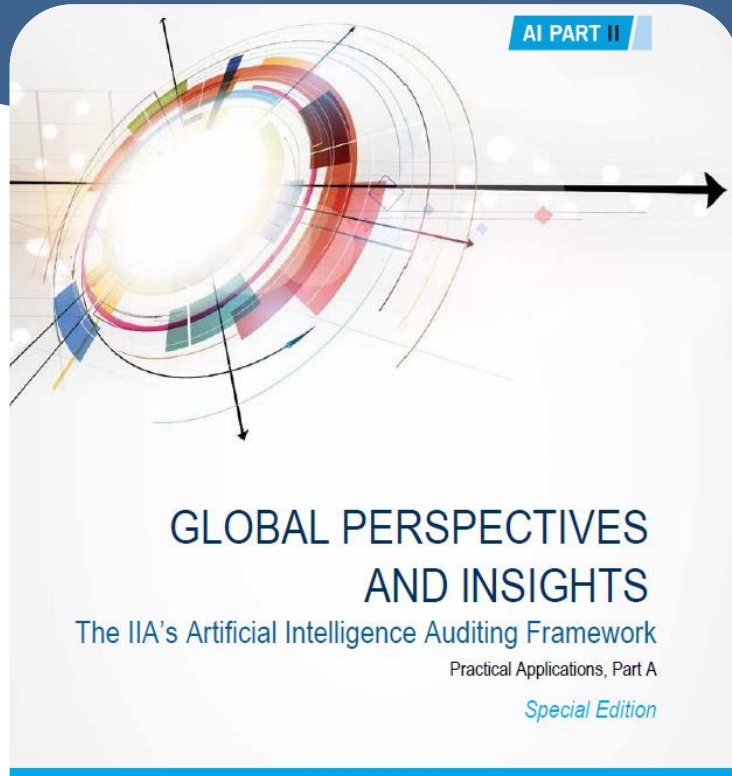


IIA AI Auditing Framework

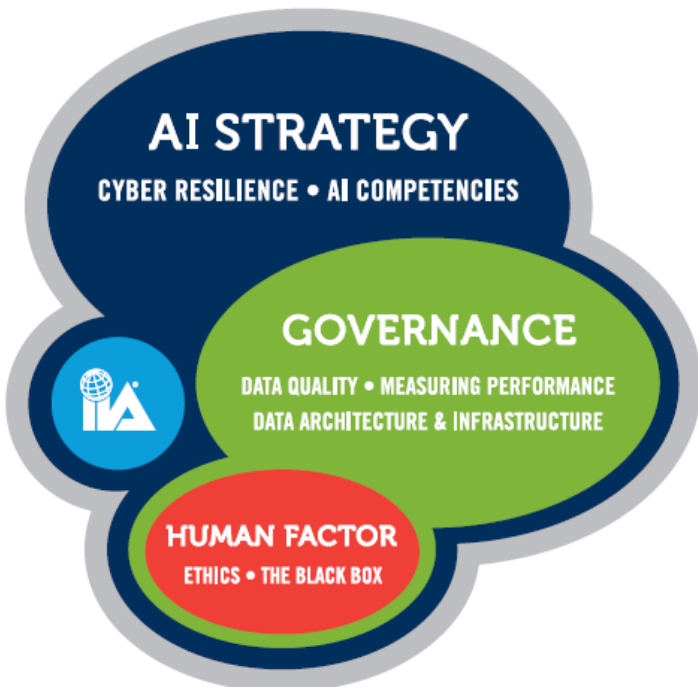


Additional: Machine Learning for Auditing

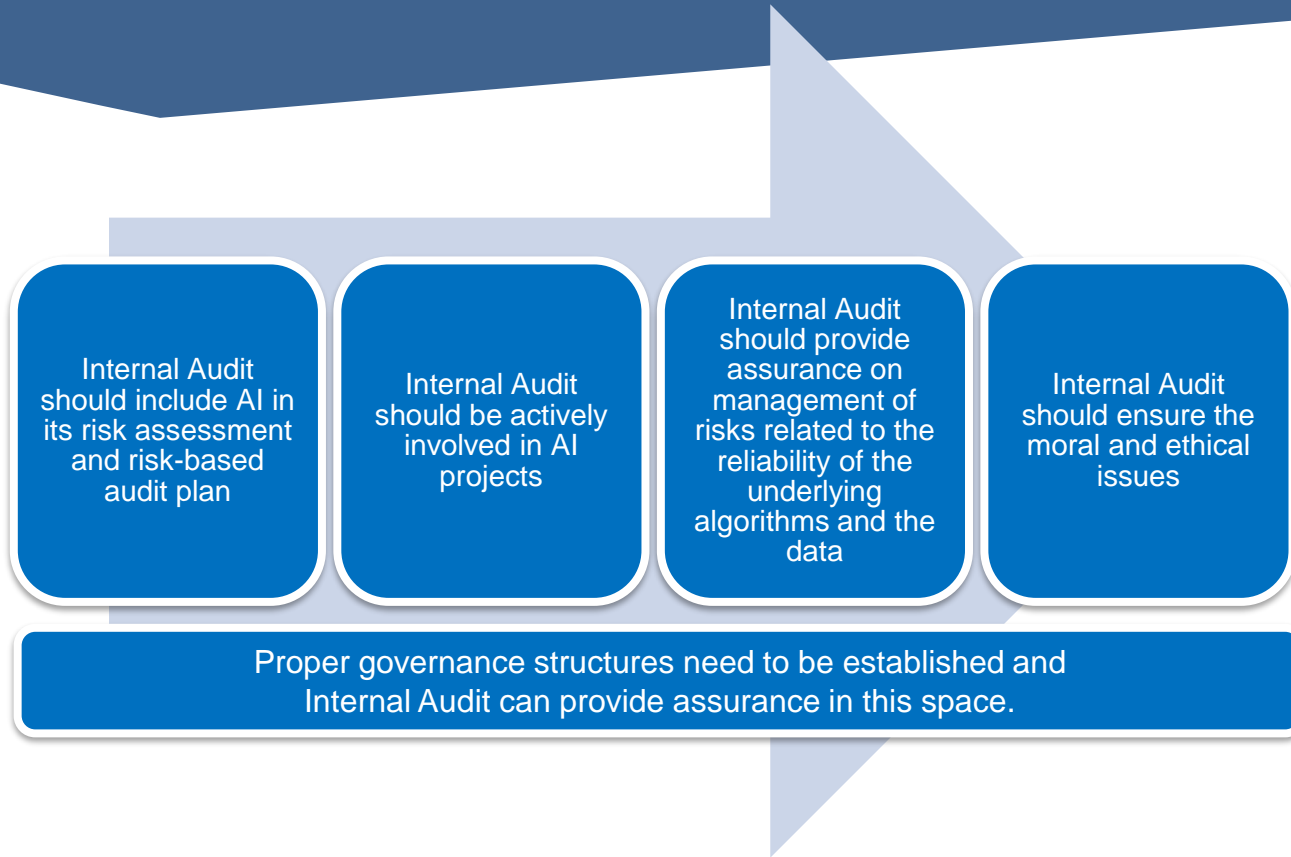
Global Perspectives and Insights



Internal audit's role in AI is to “help an organization evaluate, understand, and communicate the degree to which artificial intelligence will have an effect (negative or positive) on the organization's ability to create value in the short, medium, or long term.”



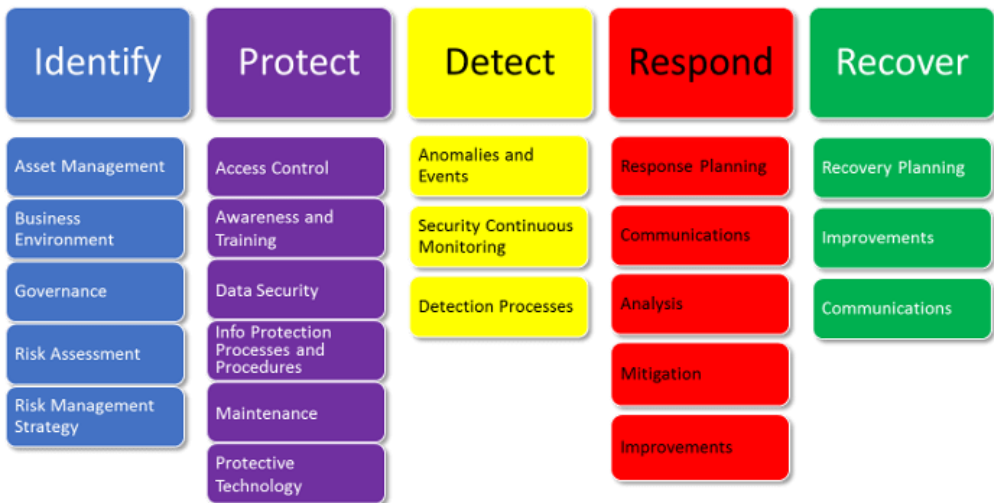
The IIA's AI Auditing Framework in providing AI-related advisory, assurance, or blended advisory/assurance services as appropriate to the organization. The Framework comprises three overarching components — AI Strategy, Governance, and the Human Factor — and seven elements: Cyber Resilience; AI Competencies; Data Quality; Data Architecture & Infrastructure; Measuring Performance; Ethics; and The Black Box.





- An organization's AI strategy might be an obvious extension of the organization's overall digital or big data strategy.
- The AI strategy should clearly articulate the intended result of AI activities.
- The AI strategies should be developed collaboratively between the organization's business leaders who can articulate the intended result of AI activities
- Both business leaders and technology professionals also need to be involved in managing the execution of the AI strategy.

NIST Cyber Security Framework



- The organization's ability to resist, react to, and recover from cyberattacks, including the intentional misuse of an organization's AI technologies for nefarious means, is becoming increasingly important.
- CAEs need to rapidly build cybersecurity competencies within their teams, continuously monitor AI/cybersecurity risks, and communicate to executive management and the board the level of risk to the organization and efforts to address such risk.



- Know how AI works.
- Understand the risks and opportunities AI presents.
- Determine whether AI outcomes are as expected.
- Be capable of recommending or taking corrective action if needed.

Such competencies will be needed within internal audit and among the first and second lines of defense.

Sample Audit Procedure on AI Strategy

Relevant AI Strategy Objectives and Activities or Procedures

Engagement or Control Objective(s)

Activities or Procedures

Be actively involved in AI projects from their beginnings, providing advice and insight contributing to successful implementation.

Attend AI project team meetings.

The organization has a defined AI strategy.

Determine whether an AI strategy has been documented and if so, **verify** that the strategy:

- Articulates the intended results of AI activities (strategic objectives).
- Articulates at a high level how the AI objectives will be accomplished (strategic plan).

Provide assurance over the readiness and response to cyber threats.

Leveraging an established cybersecurity framework, **work** collaboratively with IT and other parties to ensure effective defenses and responses are in place.

There are sufficient resources (staff and budget) to implement the AI strategy.

Review process for determining staff and budget needs to support AI.

Advise on whether the strategy adequately considers AI threats and opportunities.

Review any existing assessments of AI threats and opportunities. If no assessments exist, **make recommendations** for moving forward (how the organization could plan to identify AI threats and opportunities).



AI governance refers to the structures, processes, and procedures implemented to direct, manage, and monitor the AI activities of the organization, that:

1. Establishes accountability, responsibility, and oversight.
2. Helps to ensure that those with AI responsibilities have the necessary skills and expertise.
3. Helps to ensure that AI activities and AI-related decisions and actions are consistent with the organization's values, and ethical, social, and legal responsibilities.

Sample Audit Procedure on AI Governance

Relevant AI Governance Objectives and Activities or Procedures

Engagement or Control Objective(s)

Activities or Procedures

Provide assurance that AI governance structures have been established, documented, and are working as designed.

Review business models and organizational structure; **determine** if business models and organizational structure reflect the organization's AI strategy.

Review AI policies and procedures; **determine** whether organizational policies and procedures clearly identify AI roles and responsibilities related to AI strategy, governance, data architecture, data quality, ethical imperatives, and measuring performance.

Assess whether those with AI responsibilities have the necessary competencies to be successful. For example, those responsible for ethical imperatives should be competent in assessing the ethical behavior of those who provide human input into the AI, and should be independent of the AI activity.

Interview those with AI responsibilities.

Review AI job descriptions, requisite skills, etc., and **verify** whether those responsible have their stated qualifications.

Provide assurance that AI policies and procedures have been established and documented.

Review AI policies and procedures and **determine** if they sufficiently address AI risks.

Determine if policies and procedures provide for periodic "what if" analysis or scenario planning.

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Provide assurance that AI activity audit trails provide sufficient information to understand what AI decisions were made, and why.

Review AI audit trails.

Determine whether audit trails provide sufficient information to understand what decisions were made, and why.

Provide assurance that policies and procedures have been implemented and are working as designed, and that employees are compliant.

Observe employees implementing AI procedures.

Review helpline/hotline reports and **follow up** on any reports alleging noncompliant or malicious activities related to AI.

Interview a random sample of employees and **determine** if they are knowledgeable about AI policies and procedures.

Identify and **review** AI access policies and procedures.

Evaluate access policies and **test** access controls.

Assess whether regulatory control objectives reflect emerging regulations, standards, and guidance.

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Three major areas of software development to ensure the success of AI integration:

- **Data integration** — data from multiple sources must be integrated before AI can be incorporated into the organization's applications and systems.
- **Application modernization** — software updates will need to be made on a regular basis. Frequent, less intensive updates should replace infrequent, more intensive updates that slow down or disrupt systems.
- **Employee education** — software developers, project managers, and other technology staff need to keep up with machine learning and every aspect of the technology "stack" (the software and components that run AI).



The way that data is accessible

Information privacy and security

Roles and responsibilities for data ownership and use

Sample Audit Procedure on Data Architecture & Infrastructure

Relevant Data Architecture & Infrastructure Objectives and Activities or Procedures	
Engagement or Control Objective(s)	Activities or Procedures
<p>Provide assurance that the organization is cyber resilient. Cyber resilience includes, but is broader than, cybersecurity alone. Cyber resilience encompasses security (resistance), reaction, and recovery.</p>	<p>Understand and audit big data (see The IIA's Practice Guide: Understanding and Auditing Big Data).</p> <p>Assess whether the organization is preparing for compliance with new technology regulations, such as the EU's General Data Protection Regulation (GDPR).</p> <p>Assess whether the organization's disaster recovery protocols include AI failures, including the breakdown of controls that maintain the rules set forth by AI governance.</p>
<p>Provide assurance that the data infrastructure has the capacity to accommodate the size and complexity of AI activity set forth in the AI strategy.</p>	<p>Assess whether the infrastructure is capable of handling structured and unstructured data.</p>
<p>Provide assurance that the organization has established a data taxonomy. Evaluate the quality, completeness, and consistency of use for the enterprisewide data taxonomy.</p>	<p>Assess whether the taxonomy is robust enough to accommodate the size and complexity of AI activities.</p>



- The completeness, accuracy, and reliability of the data on which AI algorithms are built are critical.
- For AI to be successful, organizations need access to vast amounts of high quality data — data that is well-defined and in standardized formats.
- Often, systems do not communicate with each other or do so through complicated add-ons or customizations. How this data is reconciled, synthesized, and validated is also critical

Sample Audit Procedure on Data Quality

Relevant Data Quality Objectives and Activities or Procedures

Engagement or Control Objective(s)	Activities or Procedures
Provide assurance over the reliability of AI's underlying algorithms and the data on which algorithms are based.	Obtain a sample of the raw data that are inputs to AI. Verify that the organization has implemented methodologies to validate AI outcomes with actual, real-world outcomes, and that policies and procedures are in place to continuously measure, monitor, escalate, and rectify inconsistencies between the two.
Provide assurance that data input is reconciled and normalized to maximize accuracy.	Verify that the organization has policies and procedures in place to continuously measure, monitor, escalate, and rectify data accuracy and integrity issues. Confirm that the organization is consistently following and monitoring a formalized data reconciliation framework, which includes a rationale for differing methodologies and results should they exist.
Provide assurance that aggregated data is complete.	Verify that the organization has policies and procedures in place to limit data input bias.
Provide assurance that the completeness of data is measured and monitored and that any material exceptions that impact decision-making are identified and explained. This should be done whether the exceptions are determined by humans or AI.	Review AI metrics and metric reports. Assess whether those responsible for decision-making have received and considered explanations on material exceptions related to data quality.

HOW AI IS BEING USED FOR ADVERTISING



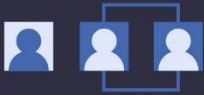
1 Facebook takes personal information about users



2 Facebook feeds this data into "FBLeaerner Flow," its name for an internal machine learning tool



3 FBLeaerner Flow runs a branching "decision tree" simulation that can be used to predict outcomes, such as consumer behaviors



4 Facebook takes the results from FBLeaerner Flow and packages them into a group of people expected to behave similarly



5 Facebook provides corporations with the ability to target these individuals with advertisements on the basis of either preventing or reinforcing this predicted outcome

The Intercept

Facebook's Corrective Actions

Facebook's challenges with AI have been widely reported. The behemoth social network has been under scrutiny over how its algorithm-fueled technologies have been used — or misused — for malicious means.

Timeline of Major Concerns:

- In Fall 2016, ProPublica reported that advertisers could use Facebook's ad-targeting tools to exclude certain races — a potential violation of federal housing and civil rights regulations.
- In September 2017:
 - Facebook disclosed that holders of fake accounts based in Russia purchased sizeable ads on divisive issues leading up to the 2016 presidential election.
 - ProPublica reported that Facebook's ad targeting tools enabled advertisers to target self-described ethnic "haters."
- In October 2017, concerns about fake news resurfaced when Facebook (and Google) posted false information about the mass shooting in Las Vegas.
- In testimony to a Senate judiciary subcommittee in late October, Facebook said the reach of Russia-backed ads stretched much further than they had originally known, reaching as many as 126 million Americans before and during the 2016 presidential election.

A low-angle, upward-looking photograph of a modern city skyline. The central focus is a tall, cylindrical skyscraper with a glass facade that reflects the sky. To its right is another tall building with a grid-like facade of windows. The sky is a clear, bright blue. A large, semi-transparent blue circle is overlaid on the center of the image, containing the text "Thank you". The top of the image shows the dark, curved structure of a bridge or overpass, framing the scene.

Thank you