# Existing TechDebt Management Solutions

#### .Key Points

- Research suggests agentic solutions, like Al-driven tools, can help identify technical debt in fintech, but specific implementations at JPMC and Wells Fargo are not publicly detailed.
- It seems likely that large financial institutions use automated tools for code analysis and machine learning to detect technical debt, aligning with industry practices.
- The evidence leans toward strategies like translating technical debt into business terms and visualizing impacts, which could be adopted by JPMC and Wells Fargo.
- Other financial institutions, like CGI, focus on collaboration and data-driven approaches, but direct case studies for JPMC and Wells Fargo are limited.

#### Implementation in Financial Institutions

Agentic solutions for technical debt identification involve using AI and automation to detect issues like code smells or self-admitted technical debt (SATD) in software systems. For JPMC and Wells Fargo, while specific implementations aren't publicly available, it's likely they use tools like machine learning models (e.g., Text CNN for SATD, achieving up to 0.691 F1-score) and code analysis platforms. These tools help prioritize debt based on business impact, such as cost of delay or risk, ensuring alignment with financial goals.

#### Strategies and Challenges

Key strategies include translating technical debt into business metrics, visualizing dependencies, and fostering collaboration between IT and business teams using frameworks like Risk and Cost Driven Architecture (RACDA). Challenges include short-term focus due to quarterly results and budget splits, which agentic solutions can address by providing real-time insights. Research suggests these approaches are common in large organizations, likely applicable to JPMC and Wells Fargo.

#### Other Financial Institutions' Practices

While direct case studies for JPMC and Wells Fargo are scarce, organizations like CGI, working with financial institutions, emphasize data-driven strategies, automation, and stakeholder collaboration. Industry trends show 121 automation artifacts (tools, plugins, scripts, bots) for technical debt management, suggesting broad adoption in fintech. Research gaps include funding models and validation of practices, relevant for financial institutions.

Survey Note: Comprehensive Analysis of Agentic Solutions for Technical Debt Identification in Fintech

This note provides a detailed examination of implementing agentic solutions for technical debt identification in financial technology (fintech) solutions, focusing on institutions like JPMorgan Chase (JPMC) and Wells Fargo, and exploring practices adopted by other financial institutions. The analysis is grounded in recent research and industry insights, acknowledging the complexity and lack of specific case studies for the mentioned institutions.

#### **Background on Technical Debt and Agentic Solutions**

Technical debt, coined by Ward Cunningham in 1992, refers to the implied cost of additional rework from choosing expedient software solutions over robust ones, impacting maintainability and evolvability (<u>Technical Debt - Wikipedia</u>). In fintech, where systems must be stable, secure, and scalable, managing technical debt is critical. Agentic solutions, involving autonomous Al-driven systems, aim to identify and manage this debt proactively, using machine learning, automation, and data-driven approaches.

#### Implementation Strategies for JPMC and Wells Fargo

While specific case studies for JPMC and Wells Fargo are not publicly available, general practices in large financial institutions suggest potential implementation strategies:

- Automation of Technical Debt Identification: Research from a systematic mapping study (Technical Debt Management Automation: State of the Art and Future
  Perspectives) identified 121 automation artifacts, including tools, plugins, scripts, and bots, for technical debt management (TDM). These can be adapted for fintech, using AI to analyze code for issues like code smells or architectural debt. For instance, machine learning models like Text CNN, achieving an F1-score of 0.686 (optimized to 0.691 with transfer learning), can identify self-admitted technical debt (SATD) in issue tracking systems like Jira (Identifying Self-Admitted Technical Debt in Issue Tracking Systems Using Machine Learning). This approach requires datasets, with 1400 sections for 80% of max F1-score, scalable for large institutions.
- Data-Driven Approaches: Financial institutions likely translate technical debt into business terms, such as risk, cost of delay, and opportunity cost, to align with business goals. Visualization tools, as suggested by CGI (<u>Technical Debt</u> <u>Management: The Road Ahead for Successful Software Delivery</u>), can show dependencies between technical debt, business features, and product quality, aiding decision-making.
- Collaboration Frameworks: Approaches like Risk and Cost Driven Architecture (RACDA) foster collaboration between business owners and development teams, ensuring technical debt management is a shared responsibility. This is crucial in fintech, where regulatory and operational pressures are high.
- Challenges and Mitigations: Challenges include short-term focus due to quarterly
  results and KPIs, overinflated stakeholder expectations from pilot projects, and
  budget splits between business (new features) and IT (maintenance). Agentic
  solutions can mitigate these by providing real-time insights into long-term costs,

optimizing budget allocation, and enforcing better agile practices (e.g., avoiding misapplication of Weighted Shortest Job First).

#### Table: Key Metrics for SATD Identification (Relevant for Fintech)

Metric	Value/Detail
Total Issues Analyzed	4,200
Total Issue Sections	23,180
SATD Issue Sections	3,277 (14.1% of total)
Initial Text CNN F1-Score	0.597
Optimized Text CNN F1-Score	0.686
Transfer Learning Improvement	0.691 (using JIRA-SEN)
Cross-Project F1-Score Range	0.561-0.709 (average 0.652)
Training Data for 80% F1-Score	1400 sections (6.7%)

This table highlights the scalability of machine learning for SATD, relevant for large fintech systems.

#### **Practices in Other Financial Institutions**

While direct case studies for JPMC and Wells Fargo are limited, insights from other organizations and research provide a broader picture:

- CGI's Approach: CGI, a large IT services company working with financial institutions, emphasizes translating technical debt into business terms, making tradeoffs transparent, and visualizing dependencies (<u>Technical Debt Management: The Road Ahead for Successful Software Delivery</u>). They use RACDA to foster collaboration, addressing challenges like short-term focus and budget splits. Research gaps include understanding the business impact of remediation timing and developing funding models, critical for fintech.
- Industry Trends: A McKinsey report (<u>Breaking Technical Debt's Vicious Cycle to Modernize Your Business</u>) notes that organizations spend 20-40% of technology estate value managing technical debt, with engineering teams dedicating 33% of time to it. This underscores the need for automation, likely adopted by financial institutions.
- Research Needs: Studies highlight the need for validating industry practices for evidence-based adoption, especially in regulated environments like fintech (<u>Technical</u> <u>Debt Management: 6 Best Practices and 3 Strategic Frameworks</u>). This includes financial models shifting focus from "debt as bad quality" to "value generation."

#### Table: CGI's Technical Debt Management Strategies (Relevant for Fintech)

Strategy	Description
Translate into Business Terms	Express technical debt as risk, cost of delay, opportunity cost.
Make Tradeoffs Transparent	Include tradeoffs in business cases for stakeholder alignment.
Visualize Dependencies	Show impacts on business features, product quality, external pressures.
Foster Collaboration	Use RACDA to align business owners and development teams.

This table summarizes strategies likely adopted by financial institutions like JPMC and Wells Fargo.

#### **Recommendations for Implementation**

Based on the analysis, here are detailed recommendations for implementing agentic solutions in fintech:

- 1. **Adopt Automated Tools**: Use Al-driven tools for code analysis and SATD identification, leveraging machine learning models trained on issue tracking data. Ensure scalability with sufficient datasets (e.g., 1400 sections for 80% F1-score).
- 2. **Integrate with Business Metrics**: Develop dashboards that translate technical debt into business terms, ensuring alignment with financial goals. Visualization tools can aid in decision-making, showing dependencies and impacts.
- Foster Collaboration: Implement frameworks like RACDA to ensure shared ownership of technical debt management, addressing challenges like budget splits and short-term focus.
- 4. **Prioritize High-Impact Debt**: Use data-driven insights to identify and prioritize technical debt with the most significant impact on system stability, security, or scalability, optimizing resource allocation.
- 5. **Invest in Research and Validation**: Collaborate with research institutions to validate practices, addressing gaps in funding models and remediation timing, crucial for regulated fintech environments.

#### Conclusion

While specific implementations at JPMC and Wells Fargo are not detailed publicly, agentic solutions for technical debt identification in fintech can leverage AI and automation, aligning with industry practices like those of CGI. Strategies include automating detection, translating

debt into business terms, and fostering collaboration. Other financial institutions adopt similar data-driven approaches, with research highlighting the need for validated practices and financial models, ensuring effective management in complex fintech systems.

#### **Key Citations**

- Technical Debt Management Automation: State of the Art and Future Perspectives
- Identifying Self-Admitted Technical Debt in Issue Tracking Systems Using Machine Learning
- Technical Debt Management: The Road Ahead for Successful Software Delivery
- <u>Technical Debt Management: 6 Best Practices and 3 Strategic Frameworks</u>
- Technical Debt Wikipedia
- Breaking Technical Debt's Vicious Cycle to Modernize Your Business

# Agentic Al Solutions for Technical Debt in Financial Services

Financial institutions face massive technical debt in aging codebases and infrastructure. To tackle this, banks are deploying autonomous Al/bot solutions at multiple levels. For example, JPMorgan Chase has moved 65% of workloads to the cloud as a deliberate strategy to "retire technical debt". At the code level, banks integrate Al into development: J.P. Morgan Payments engineers use Al code assistants (GitHub Copilot, Codeium, DevGPT, Tabnine) within IDEs like IntelliJ to improve coding efficiency. They also built PRBuddy, an Al-driven pull-request assistant that auto-generates PR descriptions, summaries and review suggestions. Internally-developed Al platforms are common: JPMorgan's LLM Suite (a model-agnostic generative-Al platform) is available to ~200,000 staff for tasks like code review and test generation. Goldman Sachs pilots a coding Al that can automatically generate ~40% of code and test cases. Citigroup is rolling out GitHub Copilot to 40,000 developers across the bank. These agentic tools catch code smells and suggest refactorings early, freeing engineers from boilerplate maintenance.

- Al Coding Assistants: LLM-powered tools (Copilot, Codeium, Tabnine) embedded in IDEs for real-time code completion, helping developers avoid introducing new debt .
- Al-Powered Code Reviews: Bots like PRBuddy or GitHub's review tools analyze pull requests automatically, flagging issues and enforcing standards.

- Custom LLM Platforms: In-house generative-Al models (e.g. JPMorgan's LLM Suite) fine-tuned on proprietary code/documents to guide refactoring and testing.
- Static Analysis & ML Tools: Traditional scanners (SonarQube, Coverity) and new Al/ML platforms (Seerene, CodeScene, AWS CodeGuru) that analyze codebases for complexity, duplication or outdated libraries.
- Legacy-Modernization Agents: Specialized AI tools to convert old code (COBOL, Perl) into specifications or new languages (see image below). These automate the hardest debt-prone tasks.

Banks are using AI coding assistants to analyze and translate legacy code (green-screen COBOL shown). For example, Morgan Stanley's DevGen.AI (GPT-based) reads legacy code into English specs, helping 15,000 developers rewrite old modules; it has processed ~9 million lines and saved ~280,000 developer-hours. Goldman Sachs similarly piloted an AI assistant that can auto-generate ~40% of some code, along with testing. Accenture reports using GPT-4 to reverse-engineer legacy COBOL into modern documentation. By automating legacy refactoring, these AI agents free engineers from "servicing technical debt" so they can focus on new architecture.

## **Integration and Deployment Strategies**

Banks embed these AI agents into their workflows and platforms:

- IDE and Devtool Integration: Al assistants run as IDE plugins (e.g. Copilot in IntelliJ) or browser extensions. JPMorgan, for instance, integrated GitHub Copilot into their JetBrains environment.
- CI/CD Pipeline Hooks: Static-analysis and Al-review tools are wired into CI/CD. For example, code scanners or LLM checks run on every commit or pull request, generating reports and comments before merge. Industry best practices explicitly recommend "embedding Al into the CI/CD pipeline" for continuous debt monitoring.
- ChatOps and Notification Bots: Some firms connect bots to collaboration tools (Slack/Teams) that alert developers to new debt issues or crawl repositories on a schedule.
- Automated Refactoring Frameworks: Experimental frameworks (often internal) can autonomously refactor detected issues or suggest fixes. For example, GitHub Copilot and DeepCode can propose code rewrites during pull requests.
- Data & Model Integration: In-house LLMs may be exposed via web services or APIs.
   JPMorgan's LLM Suite is accessed internally to assist in code review and generation

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Tools & Platforms: Key solutions include those in Table 1. Many are integrated across multiple levels (IDE, CI, issue trackers):

Tool/Platform	Туре	Key Use	Example in Finance
GitHub Copilot	Al code assistant (LLM)	Code autocomplete and generation	Used by Goldman (12K devs) and rolling out at Citi (40K devs)
Internal LLM (LLM Suite)	Custom generative Al	Code review, test writing, docs	JPMorgan's platform for devs (200K users)
PRBuddy (JPMorgan)	Al PR-review bot	Auto PR descriptions and feedback	Internal JPM tool that boosts PR quality
SonarQube	Static code analyzer	Detect code smells/security issues	Widely used across industries
AWS CodeGuru	ML-driven code review	Suggest code improvements, find bugs	Example of Al-based analyzer (bank usage)
CodeScene / Seerene	ML code intelligence	Visualize hotspots & architecture debt	Platforms cited for tech-debt mapping
Snyk / Black Duck	Dependency scanner	Identify outdated/vulnerable libs	Common tools for vulnerability scanning

DevGen.Al (Morgan Legacy-code Al Stanley)

Translate legacy code to specs

Morgan Stanley's GPT tool for Perl/COBOL

Table 1: Al/Automation tools used for code-level technical debt management. (Citations: JPMorgan blog; CIO Dive; Entrepreneur; TreasurUp; American Banker; Constellation; Seerene.\*)

## **Examples & Case Studies**

- J.P. Morgan Chase: Beyond developer tools, JPMorgan's broad tech strategy targets debt. Its CIO reports ~65% of workloads now on cloud to reduce legacy maintenance. Dev teams use LLM Suite for coding tasks and run static/AI scans in pipelines. The bank also built "PRBuddy" for automated code review. JP Morgan measured a 70% increase in code deployment velocity and 20% fewer reworks by embracing these tools.
- Goldman Sachs: CEO Marco Argenti notes all 12,000 Goldman developers now have Copilot, yielding ~20% productivity gains. They also developed an internal "GS AI" ChatGPT-style assistant for traders. Goldman's pilot of an AI coding agent can "write ~40% of code" in some cases, showing how AI handles routine coding to alleviate debt.
- Citigroup: Citi is rapidly adopting code-assistants. By April 2024, Citi planned to roll
  out GitHub Copilot to its ~40,000 developers, expecting large time-savings where
  reusable code exists. This systematic rollout is a prime example of integrating AI at
  scale to curb future debt.
- Morgan Stanley: Morgan Stanley built DevGen.AI, a custom GPT-based tool, specifically to refactor legacy code. It translates Perl and COBOL to human-readable specs, letting developers re-code in modern languages. In its first 5 months it processed ~9 million lines, saving ~280,000 developer-hours. This shows how internal agentic solutions can tackle aged code.
- Other Banks/Fintechs: Many large banks (Bank of America, Barclays, etc.) and fintech firms similarly deploy static analysis (e.g. SonarQube, Veracode, Checkmarx) and advanced tools (GitHub Advanced Security) in CI/CD to catch issues automatically. Fintech startups often leverage cloud-native code-scanning (Snyk, GitLab CI scans) and LLM-based assistants (like Copilot or Tabnine) to keep code quality high. (For example, developers widely report spending 40–50% of their time on tech debt, motivating these adoptions.)

### **Best Practices and Governance**

Technical debt programs in finance are supported by strong governance. Industry experts emphasize leadership commitment and policies. For instance, WWT recommends setting a "declared risk appetite" for acceptable debt, and regularly reporting debt metrics (incident counts, uptime, etc.) to executives . C-suite visibility ensures debt reduction is funded and prioritized. KPMG likewise warns that without unified strategy and governance, debt accumulates from quick fixes . Best practices include:

- Cross-functional oversight: Engage CIOs, architects, security and audit teams in debt reviews to balance risk versus agility.
- Debt Registers & Dashboards: Maintain an inventory of legacy systems and debt items, tracked like financial liabilities. Combine technical metrics (e.g. code complexity, coverage gaps) with business impact (risk of outages).
- Regular Reporting & KPIs: Treat debt reduction as a business goal. Track ROI of remediation (cost savings, fewer incidents) and include in dashboards.
- Incentives & Culture: Encourage "shift-left" by integrating quality gates into agile sprints. Recognize teams that refactor code and retire old services.
- Policy & Automation: Establish coding standards and automate enforcement (e.g. CI rules, static checks) so debt doesn't silently grow. An enterprise governance framework—policies, architecture reviews, "tech debt" budgeting—is critical.

Figure: Financial IT leaders often review technical debt as a business risk. Formal governance (top-down goals, risk appetite) helps ensure Al/bot initiatives for debt (like those above) are aligned with strategy. Experts stress governance and continuous monitoring to avoid unchecked debt growth .

In summary, major financial institutions are marrying AI agents with disciplined processes. They use AI bots and scanners to identify and quantify code- and architecture-level debt, and embed them in development pipelines for continuous oversight. Combined with executive-backed policies, this approach ensures that tech debt is tracked and managed systematically – turning a hidden liability into a data-driven program of modernization and efficiency.

Sources: Industry research, news reports and company publications as cited above (e.g. JPMorgan Payments blog; CIO Dive and other financial tech news; analyst reports).

Based on my research and knowledge of financial technology implementations, here's a comprehensive approach to implementing agentic solutions for technical debt identification in financial institutions:

## Current State in Major Financial Institutions

JPMorgan, Capital One, Royal Bank of Canada and Wells Fargo all have dedicated Al research teams [![CIO

Dive](claude-citation:/icon.png?validation=E5EF7C87-86BC-4C93-88B4-B14AD0A84668&cit ation=eyJlbmRJbmRleCl6MzUwLCJtZXRhZGF0YSl6eyJmYXZpY29uVXJsljoiaHR0cHM6X C9cL3d3dy5nb29nbGUuY29tXC9zMlwvZmF2aWNvbnM/c3o9NjQmZG9tYWluPWNpb2Rpd mUuY29tliwic2l0ZURvbWFpbil6ImNpb2RpdmUuY29tliwic2l0ZU5hbWUiOiJDSU8gRGl2ZSls InR5cGUiOiJ3ZWJwYWdlX21ldGFkYXRhIn0sInN0YXJ0SW5kZXgiOjl1NCwidGl0bGUiOiJK UE1vcmdhbiBDaGFzZSBsZWFkcyBiYW5raW5nIHNIY3RvciBpbiBBSSBhZG9wdGlvbjogcm Vwb3J0IHwgQ0IPIERpdmUiLCJ1cmwiOiJodHRwczpcL1wvd3d3LmNpb2RpdmUuY29tXC9u ZXdzXC9qcG1vcmdhbi1jaGFzZS1jYXBpdGFsLW9uZS1haS1hZG9wdGlvbi1sZWFkZXJzLW V2aWRlbnRcLzczMDIwOFwvliwidXVpZCl6ljY5MGIwNjYyLTYyNDktNDljOC1iYzNjLTdiZjlmN 2M4YzhlZSJ9)](https://www.ciodive.com/news/jpmorgan-chase-capital-one-ai-adoption-lead ers-evident/730208/), with Wells Fargo and Bank of America bolstering their Al Development teams, pointing to a strategy centred on retooling retail operations

[![TechInformed](claude-citation:/icon.png?validation=E5EF7C87-86BC-4C93-88B4-B14AD0 A84668&citation=eyJlbmRJbmRleCl6NDg5LCJtZXRhZGF0YSl6eyJmYXZpY29uVXJsljoiaH R0cHM6XC9cL3d3dy5nb29nbGUuY29tXC9zMlwvZmF2aWNvbnM/c3o9NjQmZG9tYWluPX RIY2hpbmZvcm1IZC5jb20iLCJzaXRlRG9tYWluIjoidGVjaGluZm9ybWVkLmNvbSlsInNpdGV OYW1lljoiVGVjaEluZm9ybWVkliwidHlwZSl6IndlYnBhZ2VfbWV0YWRhdGEifSwic3RhcnRJb mRleCl6MzU3LCJ0aXRsZSl6lkpQTW9yZ2FuLCBXZWxscyBGYXJnbywgQ2l0aWdyb3VwlG xlYWQgQUkgaGlyaW5nlHN1cmdlliwidXJsljoiaHR0cHM6XC9cL3RlY2hpbmZvcm1IZC5jb21 cL2pwbW9yZ2FuLXdlbGxzLWZhcmdvLWNpdGlncm91cC1sZWFkLWFpLWhpcmluZ1wvliwid XVpZCl6ImEzMzl1NzZlLWFhMTMtNDVmOS1hZTY4LTRlYjgwMDMyYzAxYiJ9)](https://techinformed.com/jpmorgan-wells-fargo-citigroup-lead-ai-hiring/). However, most current Al implementations focus on customer-facing applications, fraud detection, and trading rather than internal technical debt management.

## Agentic Architecture for Technical Debt Identification

### 1. \*\*Multi-Agent System Design\*\*

- \*\*Code Analysis Agents:\*\*
- Static code analyzers that scan legacy COBOL, Java, and mainframe systems
- Pattern recognition agents for identifying anti-patterns and code smells
- Dependency mapping agents to understand system interconnections
- \*\*Risk Assessment Agents:\*\*
- Security vulnerability scanners
- Performance bottleneck detectors
- Compliance gap identifiers (SOX, Basel III, GDPR)
- \*\*Impact Analysis Agents:\*\*
- Business criticality assessors
- Cost-benefit calculators for remediation
- Timeline and resource estimators

### 2. \*\*Implementation Strategy\*\*

- \*\*Phase 1: Discovery and Cataloging\*\*
- Deploy agents across trading systems, core banking platforms, and regulatory reporting systems
- Create comprehensive technical debt inventory
- Establish baseline metrics and KPIs
- \*\*Phase 2: Prioritization and Planning\*\*
- Implement ML models to score debt by business impact
- Generate automated remediation roadmaps
- Integration with existing change management processes
- \*\*Phase 3: Automated Remediation\*\*
- Code refactoring agents for low-risk improvements
- Documentation generators for undocumented systems
- Test case generation for legacy code

#### ### 3. \*\*Key Technologies and Tools\*\*

- \*\*For Financial Services Context:\*\*
- Al-powered tools can analyze large codebases, identify potential tech debt areas, and provide improvement recommendations

[![Qasource](claude-citation:/icon.png?validation=E5EF7C87-86BC-4C93-88B4-B14AD0A84 668&citation=eyJlbmRJbmRleCl6MjExMCwibWV0YWRhdGEiOnsiZmF2aWNvblVybCl6Imh 0dHBzOlwvXC93d3cuZ29vZ2xlLmNvbVwvczJcL2Zhdmljb25zP3N6PTY0JmRvbWFpbj1xYX NvdXJjZS5jb20iLCJzaXRlRG9tYWluljoicWFzb3VyY2UuY29tliwic2l0ZU5hbWUiOiJRYXNvd XJjZSIsInR5cGUiOiJ3ZWJwYWdlX21ldGFkYXRhIn0sInN0YXJ0SW5kZXgiOjE5ODksInRpd GxlljoiSG93IHRvIFJIZHVjZSBUZWNoIERIYnQgd2l0aCBBSSBpbiAyMDI0liwidXJsljoiaHR0c HM6XC9cL2Jsb2cucWFzb3VyY2UuY29tXC9ob3ctdG8tcmVkdWNILXRIY2gtZGVidC13aXR oLWFpliwidXVpZCl6ljEzOTZkNjU5LWY3YmEtNDMzMS1hZGUxLTI1YTZiMmY3ODM1ZSJ9 )](https://blog.qasource.com/how-to-reduce-tech-debt-with-ai)

- Integration with existing tools like SonarQube, Veracode, and CAST Highlight
- Custom ML models trained on financial services regulatory requirements
- \*\*Specific Agent Capabilities:\*\*
- Natural language processing for analyzing regulatory documentation
- Graph neural networks for understanding system dependencies
- Reinforcement learning for optimizing remediation sequences

#### ### 4. \*\*What Other Financial Institutions Are Doing\*\*

- \*\*JPMorgan Chase:\*\*
- Al tools can handle large datasets and identify business drivers, significantly reducing forecasting errors

[![Superiordatascience](claude-citation:/icon.png?validation=E5EF7C87-86BC-4C93-88B4-B 14AD0A84668&citation=eyJlbmRJbmRleCl6MjY3NiwibWV0YWRhdGEiOnsiZmF2aWNvblV ybCl6Imh0dHBzOlwvXC93d3cuZ29vZ2xlLmNvbVwvczJcL2Zhdmljb25zP3N6PTY0JmRvbW Fpbj1zdXBlcmlvcmRhdGFzY2llbmNlLmNvbSlsInNpdGVEb21haW4iOiJzdXBlcmlvcmRhdGFzY2llbmNlLmNvbSlsInNpdGVOYW1IIjoiU3VwZXJpb3JkYXRhc2NpZW5jZSlsInR5cGUiOiJ3

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- Heavy investment in AI research with applications expanding beyond customer service
- JPMorgan, the largest U.S. bank by assets, shows how quickly generative AI has swept through America

[![CNBC](claude-citation:/icon.png?validation=E5EF7C87-86BC-4C93-88B4-B14AD0A84668 &citation=eyJlbmRJbmRleCl6Mjg2NSwibWV0YWRhdGEiOnsiZmF2aWNvblVybCl6Imh0dH BzOlwvXC93d3cuZ29vZ2xlLmNvbVwvczJcL2Zhdmljb25zP3N6PTY0JmRvbWFpbj1jbmJjLm NvbSlsInNpdGVEb21haW4iOiJjbmJjLmNvbSlsInNpdGVOYW1IIjoiQ05CQylsInR5cGUiOiJ3 ZWJwYWdIX21ldGFkYXRhIn0sInN0YXJ0SW5kZXgiOjI3NjUsInRpdGxIIjoiSlBNb3JnYW4gQ 2hhc2UgaXMgZ2l2aW5nIGl0cyBlbXBsb3llZXMgYW4gQUkgYXNzaXN0YW50IHBvd2VyZW QgYnkgQ2hhdEdQVCBtYWtlciBPcGVuQUkiLCJ1cmwiOiJodHRwczpcL1wvd3d3LmNuYmM uY29tXC8yMDI0XC8wOFwvMDlcL2pwbW9yZ2FuLWNoYXNILWFpLWFydGlmaWNpYWwta W50ZWxsaWdlbmNlLWFzc2lzdGFudC1jaGF0Z3B0LW9wZW5haS5odG1sliwidXVpZCl6ljYw MTM5ZWFjLTZlOTYtNGE2My05ZjQ5LWE2NzUzMjgzMGE3MSJ9)](https://www.cnbc.com/2 024/08/09/jpmorgan-chase-ai-artificial-intelligence-assistant-chatgpt-openai.html)

#### \*\*Industry Trends:\*\*

- Focus on regulatory compliance automation
- Legacy system modernization programs
- Risk management enhancement through AI

#### ### 5. \*\*Implementation Challenges and Solutions\*\*

- \*\*Regulatory Concerns:\*\*
- Ensure AI decisions are explainable for audit purposes
- Maintain human oversight for critical system changes
- Comply with model risk management frameworks
- \*\*Technical Challenges:\*\*
- Integration with legacy mainframe systems
- Handling sensitive financial data securely
- Managing false positives in debt identification
- \*\*Organizational Challenges:\*\*
- Change management for traditional IT teams
- Budget allocation for technical debt remediation
- Balancing innovation with operational stability

#### ### 6. \*\*ROI and Success Metrics\*\*

- \*\*Quantifiable Benefits:\*\*
- Reduced system downtime and incident response time
- Faster time-to-market for new features

- Lower maintenance costs
- Improved regulatory compliance scores
- \*\*Key Performance Indicators:\*\*
- Technical debt ratio reduction
- Code quality metrics improvement
- Developer productivity increases
- Risk incident reduction

#### ### 7. \*\*Recommended Next Steps\*\*

- 1. \*\*Pilot Program:\*\* Start with a non-critical system to prove concept
- 2. \*\*Tool Selection:\*\* Evaluate existing technical debt tools and Al platforms
- 3. \*\*Team Formation:\*\* Build cross-functional teams including developers, risk managers, and compliance officers
- 4. \*\*Governance Framework:\*\* Establish policies for Al-driven technical decisions
- 5. \*\*Vendor Partnerships:\*\* Consider partnerships with fintech companies specializing in Al-driven code analysis

The key to success in financial services is balancing innovation with risk management, ensuring that agentic solutions enhance rather than replace human judgment, especially in areas affecting customer data and regulatory compliance.

## Metrics to Evaluate Technical Debt

For evaluating a tech debt management agentic system enhanced with AI in the fintech industry, it is crucial to select metrics that comprehensively measure the technical debt's extent, impact, and management effectiveness. Given the fintech sector's high demands for security, reliability, and agility, these metrics should also reflect risks and operational efficiency. Based on the latest research and expert insights, the following key metrics and evaluation dimensions are recommended:

## **Key Metrics to Evaluate Technical Debt Management in Al-Driven Fintech Systems**

## 1. Technical Debt Ratio (TDR)

- Measures the cost to fix technical debt relative to the size or value of the codebase or system.
- Indicates the proportion of effort spent on maintenance/refactoring versus new development.
- A lower TDR (ideally under 5%) reflects healthier code quality and debt management.
- Useful for communicating debt levels to business stakeholders and planning remediation123.

## 2. Code Complexity Metrics

- Cyclomatic complexity: Number of possible execution paths indicating code intricacy.
- Cognitive complexity: How difficult the code is to understand and maintain.
- Dependency complexity: Degree of coupling between modules or services.
- High complexity correlates with increased risk and maintenance effort, critical in fintech for stability and compliance23.

## 3. Bug Density and Defect Metrics

Number of bugs per lines of code or per module.

- Tracks new bugs reported versus bugs resolved over time.
- High bug density signals unstable or risky code, impacting fintech system reliability and customer trust12.

## 4. Code Smells and Quality Indicators

- Identification of problematic code patterns such as duplicated code, long methods, or poor naming.
- Al tools can detect and prioritize these smells to guide refactoring efforts.
- Helps maintain clean, maintainable code critical for fintech agility and security24.

## 5. CI/CD Pipeline Stability and Failure Rates

- Percentage of deployments or code commits that fail and require remediation (hotfixes or rollbacks).
- Frequency of CI/CD failures indicating pipeline robustness.
- Important for fintech to ensure rapid, reliable delivery without introducing new debt or risks1.

## 6. Test Coverage and Automated Testing Effectiveness

- Percentage of code covered by automated tests.
- Al-driven automated testing and test case generation to prevent new technical debt.
- High coverage and effective tests reduce regression risk and improve code confidence25.

## 7. Risk and Impact Metrics

- All and ML models can assess risk scores related to the probability that new changes disrupt existing features.
- Measures the potential operational impact of technical debt.

• Essential in fintech where system outages or errors can have severe financial and reputational consequences 3.

## 8. Al-Driven Prioritization and Early Detection Metrics

- Metrics on how effectively AI predicts and prioritizes areas likely to develop technical debt.
- Early detection rates of potential debt before it escalates.
- Enables proactive debt management, crucial for fintech innovation cycles and regulatory compliance 54.

## 9. Developer Productivity and Maintenance Cost Reduction

- Improvements in developer efficiency (e.g., % increase in feature delivery speed).
- Reduction in maintenance costs attributable to Al-driven debt management.
- Demonstrates business value and ROI of the agentic system in fintech environments6.

## 10. Legacy System Analysis and Modernization Progress

- Metrics on legacy code analyzed and refactored or migrated.
- Progress in reducing monolithic architectures or outdated technologies.
- Supports fintech's need to modernize core systems for scalability and integration with new tech<u>53</u>.

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Metric Category Description Importance in Fintech

Technical Debt Ratio (TDR)	Cost to fix debt vs. codebase size	Balances new features vs. maintenance efforts
Code Complexity	Cyclomatic, cognitive, dependency complexity	Indicates maintainability and risk
Bug Density and Defects	Bugs per lines of code, bug resolution rates	Reflects code stability and operational risk
Code Smells and Quality	Detection of problematic code patterns	Supports clean, secure, and maintainable code
CI/CD Pipeline Stability	Deployment failure rates and remediation	Ensures reliable delivery without increasing debt
Test Coverage and Automation	% code covered by tests, Al-driven test generation	Prevents regressions, improves confidence
Risk and Impact Scores	Al-assessed risk of feature disruption	Critical for fintech reliability and compliance
Al Prioritization and Early Detection	Effectiveness of AI in predicting and prioritizing debt areas	Enables proactive management and reduces surprises
Developer Productivity & Cost	Efficiency gains and maintenance cost savings	Demonstrates business impact and ROI
Legacy System Modernization	Progress in refactoring/migrating legacy code	Supports fintech agility and integration with emerging tech

### Conclusion

An AI-powered tech debt management system in fintech should be evaluated using a blend of traditional technical debt metrics (like TDR, complexity, bugs) and AI-specific metrics (like predictive prioritization and early detection effectiveness). These metrics collectively assess the system's ability to reduce risk, improve code quality, enhance developer productivity, and support strategic modernization—key factors for fintech organizations operating in a highly regulated and competitive environment.

This comprehensive metric framework enables fintech firms to make data-driven decisions, optimize resource allocation, and maintain a sustainable development pace while managing technical debt effectively with AI assistance 1265437.

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- 3. <a href="https://vfunction.com/blog/how-to-measure-technical-debt/">https://vfunction.com/blog/how-to-measure-technical-debt/</a>

- 4. <a href="https://www.agedigital.com/blog/ai-tools-for-technical-debt-management/">https://www.agedigital.com/blog/ai-tools-for-technical-debt-management/</a>
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#### **Technical Performance Metrics**

#### **Detection Accuracy**

- Precision and recall rates for identifying tech debt instances
- False positive/negative rates in code quality assessment
- Coverage percentage of codebase analyzed
- Time-to-detection for new tech debt accumulation

#### **Remediation Effectiveness**

- Success rate of automated fixes and suggestions
- Code quality improvement scores (cyclomatic complexity, maintainability index)
- Reduction in technical debt ratio over time
- Bug reduction rates post-remediation

## **Financial Impact Metrics**

#### **Cost Efficiency**

- Cost per tech debt issue resolved
- Development time savings (hours/week saved on maintenance)
- Reduced incident response costs
- ROI calculation comparing system costs vs. savings from prevented technical issues

#### **Productivity Gains**

- Developer velocity improvements (story points delivered per sprint)
- Reduced time spent on legacy code maintenance
- Faster feature delivery cycles
- Decreased context-switching overhead

## **Risk Management Metrics (Critical for Fintech)**

#### **Security Enhancement**

- Number of security vulnerabilities identified and resolved
- Compliance gap detection accuracy
- Mean time to remediate security-related tech debt
- Reduction in security incident frequency

#### **Operational Stability**

- System uptime improvements
- Reduction in production incidents
- Decreased mean time to recovery (MTTR)
- Performance optimization achievements (latency, throughput)

## **Regulatory Compliance Metrics**

#### **Audit Readiness**

- Documentation completeness scores
- Compliance gap identification accuracy
- Time to generate audit-ready reports
- Regulatory requirement coverage percentage

#### **Quality Assurance**

- Code review process improvements
- Testing coverage enhancements
- Documentation quality scores
- Change management process adherence

## **Al Agent Performance Metrics**

#### **Learning and Adaptation**

- Model accuracy improvement over time
- Pattern recognition effectiveness for domain-specific issues
- Recommendation relevance scores from developer feedback
- Knowledge base growth and refinement rates

#### **Autonomous Operation**

- Percentage of issues resolved without human intervention
- Escalation accuracy (knowing when to involve humans)
- Decision confidence scores
- Integration success with existing development workflows

### **User Experience and Adoption Metrics**

#### **Developer Satisfaction**

- User adoption rates across development teams
- Feedback scores on AI recommendations
- Time savings reported by developers
- Training completion rates and effectiveness

#### **System Usability**

- Dashboard utilization rates
- Report generation frequency and usage
- API integration success rates
- Mobile/web interface engagement metrics

## **Business Continuity Metrics**

#### **Scalability Assessment**

- Performance under increased codebase size
- Multi-repository handling efficiency
- Concurrent user support capabilities
- Resource utilization optimization

#### **Integration Success**

- Compatibility with existing fintech tech stacks
- Third-party tool integration success rates
- Data migration accuracy and completeness
- Workflow disruption minimization

## **Advanced Analytics Metrics**

#### **Predictive Capabilities**

- Accuracy of tech debt accumulation forecasts
- Early warning system effectiveness
- Trend analysis precision
- Resource planning optimization

#### **Benchmarking**

- Industry standard comparisons
- Peer organization performance metrics
- Best practice adherence scores
- Innovation impact measurements

For a fintech-specific implementation, I'd particularly emphasize the risk management and compliance metrics, as these are critical for regulatory requirements and customer trust. The system should also track metrics related to data privacy, transaction processing reliability, and integration with core banking systems.

Would you like me to elaborate on any specific metric category or discuss implementation strategies for measuring these KPIs?

# Al-Driven Agentic System for Technical Debt Management in FinTech

## **Objective**

To build an Al-powered agentic system that continuously identifies, assesses, and manages technical debt across financial technology systems, ensuring long-term code quality, architecture soundness, and delivery agility.

## **Key Areas for Technical Debt Identification**

#### 1. Code-Level Debt

Subcategory	What to Look For	Detection Approach
Code Complexity	Nested conditions, long methods, god classes	AST parsing, Cyclomatic complexity scoring
Dead/Unused Code	Legacy code no longer in use	Static code analysis
Duplicate Code	Copy-pasted logic across files/modules	Hash-based or token-based code clone detection
Low Test Coverage	Missing unit/integration tests	Integration with code coverage tools (e.g., JaCoCo, Istanbul)
Deprecated Libraries	Old or insecure libraries	Dependency scanning tools (Snyk, OWASP, etc.)

### 2. Architectural/Design Debt

Subcategory	What to Look For	<b>Detection Approach</b>
Tight Coupling	Hard-coded dependencies between	Dependency graphs,
	modules/services	architecture rule violations

Data Silos	Inconsistent data definitions across systems	Schema diffing, data model analysis
Lack of Modularity	Monolithic designs in microservices-based expectations	Service boundary detection via traffic/API analysis
Scalability Bottlenecks	Poor partitioning or replication logic	Performance testing insights, resource profiling

#### 3. Infrastructure/CI-CD Debt

Subcategory	What to Look For	Detection Approach
Manual Processes	Repeated manual deployment or testing steps	CI/CD workflow analysis (GitHub Actions, Jenkins logs)
Inconsistent Environments	Works-in-dev but fails-in-prod issues	Container diffing, IaC drift detection
Lack of Observability	No logs, alerts, or metrics for core systems	Monitoring coverage analysis
Long Build/Deploy Time	Slow delivery pipelines	Time-to-release metrics, pipeline trace analysis

## 4. Documentation & Knowledge Debt

Subcategory	What to Look For	Detection Approach	
Outdated READMEs	Instructions that don't match the code	Git diff + natural language comparison	
No System Diagrams	Missing high-level architectural diagrams	Prompting teams to auto-generate using model-based tools	
Poor Onboarding Docs	Difficulty for new devs to understand the system	Feedback loop from onboarding sessions	

## **Evaluation Metrics for Agentic System**

#### A. Quantitative Metrics

Metric Description

Debt impacted

Mean Time to Detect (MTTD)

Time taken to flag a new debt instance

Mean Time to Resolve (MTTR)

Time taken to resolve after detection

Risk Score per Module Combines severity, impact, and frequency

Test Coverage % Pre- and post-intervention comparison

Build Time Reduction Improvements in CI/CD pipelines

# of Auto-Fixes Suggested/Applied Agentic interventions per sprint

#### **B. Qualitative Metrics**

Metric Description

Developer Satisfaction Score Based on survey on dev workflow improvements

Ease of Onboarding New hire ramp-up feedback

Code Review Efficiency Reduction in back-and-forth in PRs

Architecture Decision Auditability Clarity in why certain systems evolved

## **How Al Agent Can Help**

- Auto-scan PRs for code smell (based on pre-trained LLM/code analysis models)
- Continuously monitor CI/CD logs for patterns of failures and inefficiencies
- **Natural language interface** to query debt metrics (e.g., "Show modules with highest coupling")
- Propose refactors or remediation using learned patterns from past resolutions
- Generate architecture visualizations from existing systems for clarity

Let me know if you'd like this in .docx format or want a visual/slide version too.

# TruffleHog, Checkmarx One, Black Duck, SonarQube

# Comparative Analysis: TruffleHog, Checkmarx One, Black Duck, SonarQube

This report examines **TruffleHog**, **Checkmarx One (CheckmarxX)**, **Black Duck**, and **SonarQube** across multiple dimensions of code scanning: what they scan, security (vulnerabilities, secrets), license compliance, code quality/technical debt (metrics like complexity, coverage), language support, CI/CD/SCM integration, and reporting.

## **TruffleHog**

- Scope of Scanning: TruffleHog is a specialized *secrets* scanner. It hunts for exposed credentials (API keys, passwords, tokens, etc.) in a wide range of artifacts. It can scan Git repositories (including full commit history), local file systems, Docker container images, cloud storage (S3, GCS), CI logs (e.g. CircleCI, Travis CI, Jenkins), Postman workspaces, and more. It even decodes common encodings (base64, zip, docx, etc.) to find secrets in binaries or documents. A single TruffleHog run can target multiple data sources (e.g. trufflehog docker --image ..., trufflehog git ..., etc.).
- Security Vulnerabilities / Secrets: TruffleHog's sole focus is secret exposure. It
  uses a growing library (700+ detectors) of patterns and API-based verification to
  detect and confirm live secrets. It does not perform general SAST (source code
  vulnerability) analysis or OWASP-type security flaw detection; only leaks of
  credentials. It has no license compliance or vulnerability scanning of code; those are
  outside its scope.
- Code Quality / Technical Debt: TruffleHog does not assess code quality or technical debt at all. It has no support for metrics like cyclomatic complexity, code duplication, maintainability indices, or test coverage.
- Language Support: TruffleHog is language-agnostic; it scans text/byte content for secret patterns rather than parsing code by language. It works on any code or file type containing secrets.
- CI/CD & SCM Integration: TruffleHog provides command-line subcommands and a
  GitHub Action. It natively supports scanning within CI pipelines by specifying
  branches or commit ranges. It can be run as part of Jenkins, CircleCI, Travis CI
  workflows, or pre-commit hooks. It has explicit modes for GitHub and GitLab
  organizations and repos. (While not explicitly documented for Bitbucket, its "git" mode
  can scan any cloneable repo.)
- Output & Reporting: TruffleHog outputs to the console by default. It can produce JSON output for machine parsing (e.g. --json flag shows detailed findings). In CI

use, it can return a non-zero exit code to fail builds on detected secrets (with --fail). There is no built-in web dashboard – results must be consumed via logs or by integrating with other reporting tools.

**Limitations:** TruffleHog does *not* scan for open-source license issues, code vulnerabilities (other than confirmed secrets), or code quality. It will miss security flaws in code logic, and it does not report any code metrics or test coverage information.

## **Checkmarx One (CheckmarxX)**

Scope of Scanning: Checkmarx One is a unified AppSec platform encompassing
multiple engines. It includes SAST for custom code, SCA for open-source
dependencies, Secrets Detection, Container Security, IaC Security, and more. In
practice: it scans source code (e.g. Java, C#, JavaScript, Python, etc.) for security
bugs via static analysis; it analyzes application dependency manifests and binaries
for open-source components; it inspects container images and configurations; and it
scans infrastructure-as-code files (Terraform, CloudFormation, Kubernetes
manifests) for misconfigurations or compliance issues.

#### Security Vulnerabilities:

- Code (SAST): Checkmarx's SAST engine finds hundreds of vulnerability types (e.g. SQLi, XSS, deserialization flaws) in source code across many languages.
- Dependencies (SCA): Its SCA identifies known CVEs and license risks in third-party libraries (Java JARs, NPM modules, etc.) and can enforce license policies.
- Secrets: It actively scans code for hard-coded secrets (API keys, credentials) with its Secrets Detection module.
- laC: The laC module finds security and compliance issues in laC files (e.g. misconfigured AWS settings).
- Container: The Container Security scans images and configurations for vulnerabilities and insecure settings.
- License Compliance: Checkmarx's SCA provides license identification and compliance reporting for detected open-source components. It can generate SBOMs and enforce policies on license use.
- Code Quality / Technical Debt: Checkmarx focuses on security rather than code
  quality metrics. It does not compute code duplication rates, cyclomatic complexity, or
  maintainability indices. It does not measure test coverage or technical debt. (It offers
  "Repository Health" scoring, but this is a security-centric health metric, not a classic

code quality score.)

- Language Support: Checkmarx supports 75+ programming languages and frameworks, including common enterprise stacks (Java, .NET, Python, JavaScript/TypeScript, C/C++, Go, PHP, Ruby, etc.). It also supports scanning of IaC languages (YAML, JSON for K8s, Terraform HCL, etc.).
- CI/CD & SCM Integration: Checkmarx integrates with all major CI/CD and source control platforms. It has plugins/extensions and webhooks for Jenkins, GitLab CI/CD, GitHub Actions, Azure DevOps, Bitbucket, and more. (For example, a Jenkins plugin "adds an automatic code scan by Checkmarx server and shows results in Jenkins".) It can be triggered on commit/PR events and send results to issue trackers (e.g. Jira) or chat tools.
- Output & Reporting: Checkmarx provides a web-based portal with dashboards and detailed scan reports. Users can generate PDF or HTML summary reports of scan results, filter by severity, track trends over time, and assign issues. It offers "risk-based" remediation guidance (e.g. OWASP Top 10, PCI compliance). Reports can be exported, and API/IDE integrations provide in-IDE guidance for developers.

**Limitations:** Checkmarx does not natively offer code quality metrics (like code duplication or test coverage). It also does not focus on runtime code coverage or unit test results. (Coverage can be collected by other tools and fed into reports separately.) Its pricing and setup are enterprise-level.

## **Black Duck (Synopsys)**

- Scope of Scanning: Black Duck is a Software Composition Analysis (SCA) tool for open-source management. It scans all code artifacts to discover open-source components. This includes scanning build outputs and code via multiple technologies: it parses package manifests (Maven POMs, npm/yarn, etc.), performs Dependency Analysis (using package managers) and Codeprint Analysis (inspecting source/binaries to find libraries even if not declared). It also does Binary Analysis (examining compiled binaries, firmware, and container images) to identify embedded components.
- Security Vulnerabilities: Black Duck maps identified components to known vulnerabilities (CVE data) via its Security Advisories. It alerts on vulnerable or end-of-life libraries in the codebase. It can continuously monitor for newly disclosed vulnerabilities in your dependencies after the initial scan.
- License Compliance: A core feature of Black Duck is license detection. For every discovered component, it identifies associated open-source licenses and flags any that violate your policies. It generates compliance reports and "notices" reports listing all licenses and obligations.

- Code Quality / Technical Debt: Black Duck provides open-source project health
  metrics (e.g. community activity, commit history) to help gauge the quality and
  maturity of dependencies. However, it does not analyze proprietary custom code for
  code smells or test coverage. There is no notion of "technical debt" in the sense of
  code quality in Black Duck; its "debt" focus is on license risk and outdated
  components.
- Code Coverage / Tests: Black Duck does not deal with unit tests or code coverage at all.
- Language Support: Black Duck SCA supports a wide range of languages and build systems. It can analyze Java (Maven, Gradle), JavaScript/TypeScript (npm, Yarn), Python (pip, Conda), C/C++ (Conan, CMake, BitBake), .NET (NuGet), Ruby (Gems), Go, PHP (Composer), Rust (Cargo), and many others. It also supports scanning generic files (ZIP, TAR, etc.) and compressed/binary formats.
- CI/CD & SCM Integration: Black Duck integrates into DevOps pipelines via plugins and APIs. It can be run as part of the build (Maven plugin, Gradle plugin, Jenkins plugin, GitLab, GitHub Actions). It also hooks into container registries and artifact repositories. You can enforce policies to block builds on policy violations. (Documentation lists integrations with build tools, CI servers, and SDLC tools.)
- Output & Reporting: Black Duck produces SBOMs (Software Bill of Materials) in SPDX or CycloneDX format, vulnerability and license reports, and policy violation dashboards. It generates "Software Composition Analysis" reports that list all components, their versions, known issues, and licenses. Notifications can be sent for new vulnerabilities.

**Limitations:** Black Duck does **not** scan source code for custom security flaws or measure code quality. It won't tell you about code coverage or in-house coding issues. It is also not designed for secrets scanning or dynamic analysis. Its focus is purely on open-source risk.

## **SonarQube**

- Scope of Scanning: SonarQube is a static analysis platform focused on code quality and security of custom code (and, with add-ons, some third-party code). By default it performs deep analysis of source code in many languages, detecting bugs, code smells, and some vulnerability patterns (e.g. taint analysis for injection issues). It tracks metrics like duplication, cyclomatic complexity, code smells, and technical debt (estimation of effort to fix issues). SonarQube also integrates unit test results and code coverage reports: if coverage data (e.g. from JaCoCo, Cobertura) is provided, SonarQube visualizes code coverage and shows which lines are tested.
- **Security Vulnerabilities:** Out of the box, SonarQube (Developer Edition and above) includes security rules (SAST) such as OWASP Top 10 and CWE. It can detect common vulnerabilities (e.g. SQLi, XSS, hard-coded credentials in some editions).

Starting 2025, **SonarQube Advanced Security** (via acquisition of Tidelift) is rolling out SCA for open-source components, plus advanced taint-tracking (dataflow across components) and better license compliance. It also has *Secrets Detection*: even in current versions it can flag hardcoded secrets in code.

- License Compliance: Traditional SonarQube does not track licenses. However, the new Advanced Security extension will add Software Composition Analysis, including license scanning and SBOM generation.
- Code Quality / Technical Debt: SonarQube's core strength is code quality. It computes metrics such as duplicated code percentage, cyclomatic complexity, class complexity, code smells, and technical debt ratio. It represents technical debt as the estimated time to fix issues, and can enforce quality gates (e.g. "no leaks", "test coverage >= 80%"). SonarQube has a built-in technical debt ratio (debt vs development time). It also visualizes code coverage gaps, helping teams focus testing where needed.
- Code Coverage / Tests: SonarQube integrates with test coverage tools. It does
  not run tests itself, but it ingests coverage XML reports and shows uncovered lines.
  As a result, projects get immediate visibility into coverage metrics on the Sonar
  dashboard.
- Language Support: SonarQube supports dozens of languages (Java, JavaScript, TypeScript, Python, C#, C/C++, PHP, Go, Kotlin, Swift, Ruby, and many more). (All major languages in modern development are covered, with language-specific rule sets.)
- CI/CD & SCM Integration: SonarQube is designed for DevOps pipelines. It has
  official plugins and integrations for Jenkins, Azure DevOps, GitHub Actions, GitLab
  CI, Bitbucket Pipelines, etc. It can be invoked as a Maven/Gradle/NPM/CLI scanner
  in builds. It can also decorate pull requests/merge requests on
  GitHub/GitLab/Bitbucket by reporting issues inline. SonarCloud (the cloud offering)
  similarly integrates with SCM.
- Output & Reporting: SonarQube provides an interactive web dashboard showing
  issues by severity, code coverage, duplications, and maintainability. It allows
  exporting issues and reports in PDF or CSV. Its "Issues" interface guides developers
  to fix specific code problems. Security reports can be generated (e.g. OWASP
  compliance, SAST results). Historical trends and global issues are tracked over time.

**Limitations:** SonarQube by itself does not scan binaries or container images. It historically did not handle OSS license management (though that is changing with Advanced Security). Its vulnerability detection for third-party code was limited until the 2025 update. SonarQube also does not natively scan IaC or Kubernetes YAML files (except via custom plugins or its new IaC scanning feature).

## **Summary Tables**

**Table 1: Scanning Scope and Security Coverage** 

Capability / Scan Surface	TruffleHog	Checkmarx One	Black Duck SCA	SonarQube
Source code (custom)	✓ (secrets only)	✓ (SAST for vulnerabilities)	✓ (component inventory, via build/scan)	✓ (bugs, code smells, some vulnerabilities)
Open-source dependencies	★ (ignores OSS specifics)	✓ (SCA: vulnerabilities & licenses)	✓ (identifies OSS components & issues)	Partial (with Adv. Security: SCA for CVEs, licenses)
Binaries / Artifacts	✓ (Docker, encoded files)	✓ (container scanning module)	✓ (binary analysis for firmware, container images)	X (does not scan binaries or images)
Containers / Images	✓ (scan Docker images for secrets)	✓ (Container Security)	✓ (full SCA on container images)	X (SonarQube does not inspect container images)
Infrastructure-as- Code	(not a feature)	✓ (IaC scanning for misconfigs)	(not in scope)	✓ (with Advanced Security: IaC scanning)
Secrets/Credentia Is	✓ (primary feature)	✓ (Secrets detection module)	(no secrets module)	✓ (builtin secrets detection)
Known Vulns in Code	×	✓ (SAST finds code flaws)	✓ (checks OSS libs vs CVEs)	✓ (SAST rules + upcoming SCA)
License Compliance	×	✓ (via SCA)	✓ (identifies OSS licenses, policy)	(soon in Adv. Security for OSS)
Code Quality Metrics	×	×	Partially (OSS project quality only)	✓ (duplication, complexity, maintainability)
Test Coverage Integration	×	×	×	✓ (ingests coverage reports)

Table 2: Language, CI/SCM Integration, and Reporting

Aspect	TruffleHog	Checkmarx One	Black Duck SCA	SonarQube
Languages	Any (text/byte streams)	75+ languages (enterprise)	All mainstream (Java, C/C++, .NET, JS, Python, Ruby, etc.)	~30+ languages (Java, JS, Python, C#, Go, etc.)
SCM/CD Integrations	GitHub/Git Lab (via API), Jenkins, CircleCI, Travis, etc.	Git (GitHub/GitLab/Bitbu cket), Jenkins, Azure DevOps, etc. (plugins/webhooks)	Integrates via build tools (Maven/Gradle plugins), Jenkins, GitHub, GitLab pipelines	GitHub/GitLab/Bitb ucket hooks, Jenkins plugin, Azure Pipelines, etc.
Output/Repo rting	CLI/JSON output only. No dashboard.	Web dashboard + downloadable reports (PDF/HTML), Jira/Slack integration	Web UI with SBOM reports, vulnerability/lic ense dashboards, SBOM (SPDX/Cyclon eDX) exports	Web dashboard showing issues, code metrics, coverage; PDF/CSV export, quality gate status
License Costs	Free/Open -source	Commercial (enterprise)	Commercial (enterprise)	Community Edition (free); commercial editions for advanced features

## **Notable Differences and Complementarities**

- Specialization vs. Generalization: TruffleHog is highly specialized (secrets scanning) and does that one thing very broadly. Checkmarx and Black Duck are enterprise AppSec tools focusing on security: Checkmarx on custom code and secrets, Black Duck on open-source risk. SonarQube is focused on code quality (duplication, complexity, coverage) and basic SAST.
- Security vs. Quality: Checkmarx and Black Duck primarily hunt security and license issues (and are often used together: SAST + SCA). SonarQube emphasizes maintainability and technical debt metrics, though it is improving its security coverage

(including SCA and secrets). TruffleHog complements all by plugging the gap of leaking credentials.

- Open Source License Handling: Black Duck has the most mature license compliance scanning (policy management, notices). Checkmarx SCA handles license risks. Sonar's OSS license support is new (2025). TruffleHog does nothing in this area.
- Code Coverage & Tests: Only SonarQube integrates unit test coverage metrics inherently. The others have no concept of test coverage. Sonar is the choice for tracking technical debt and coverage; Checkmarx/Black Duck are not intended for that.
- Language Coverage: All tools cover mainstream languages. Checkmarx and Sonar lead in number (75+ or dozens). Black Duck covers any language with an open-source ecosystem. TruffleHog works on any language (since it doesn't parse code).
- CI/CD & Workflow: All four can be hooked into CI/CD pipelines. Checkmarx and Black Duck have official plugins for Jenkins/GitLab/etc. SonarQube also has rich CI integration and PR decoration. TruffleHog is scriptable and has a GitHub Action.
- Reporting: Checkmarx and Black Duck provide centralized dashboards and policy enforcement. SonarQube provides detailed per-issue views and quality gate dashboards. TruffleHog just prints to console or JSON.

In summary, **TruffleHog** is best for secret-scanning any repo or artifact. **Checkmarx One** is a broad AppSec suite (SAST, SCA, secrets, IaC) for enterprise code security. **Black Duck** is the go-to for open-source vulnerability and license management. **SonarQube** shines at code quality/metrics and also covers security and (with add-ons) OSS scanning. Organizations often use them in combination: e.g. SonarQube for quality/coverage, Checkmarx/Black Duck for deep security/license checks, and TruffleHog for catching accidental credential leaks.

**Sources:** Official product documentation and technical blogs were used throughout. Each tool's website or documentation provides detailed feature listings as cited above.

## Understanding Security and Code Quality Scanning Tools: TruffleHog, CheckMarx, BlackDuck, and SonarQube

## **Individual Tool Capabilities**

## **TruffleHog: Secrets Detection Specialist**

TruffleHog is a specialized secrets scanning tool that focuses exclusively on finding exposed credentials, API keys, passwords, and other sensitive information within code repositories 12. The tool digs deep into version history, scanning not just current code but also deleted code, comments, Docker images, and various file encodings to uncover hidden secrets 13. TruffleHog supports over 800 credential types and implements verification logic to confirm whether detected secrets are actually valid and active, significantly reducing false positives 34.

The tool operates across multiple platforms including Git repositories, GitHub, GitLab, S3 buckets, CI logs, and various collaboration platforms like Slack and Jira <u>4</u>. TruffleHog's strength lies in its ability to scan beyond just source code repositories, extending to filesystems, Docker containers, and cloud storage <u>3</u>.

## CheckMarx: Security-Focused Static Analysis

CheckMarx is primarily a Static Application Security Testing (SAST) tool that analyzes source code to identify security vulnerabilities without executing the program <u>56</u>. The platform performs comprehensive security vulnerability detection, including SQL injection, cross-site scripting (XSS), buffer overflows, and other common security flaws <u>57</u>. CheckMarx also incorporates Software Composition Analysis (SCA) capabilities to scan open-source components for known vulnerabilities and licensing issues <u>6</u>.

The tool offers Interactive Application Security Testing (IAST) that combines static and dynamic analysis to identify vulnerabilities in running applications <u>6</u>. CheckMarx provides detailed remediation guidance with code fix suggestions and integrates seamlessly with CI/CD pipelines to automate security scans throughout the development process <u>56</u>.

## **BlackDuck: Software Composition Analysis Leader**

BlackDuck specializes in Software Composition Analysis (SCA), focusing on managing security, quality, and license compliance risks associated with open-source and third-party

code <u>89</u>. The tool identifies both direct and transitive dependencies declared by package managers, detects dependencies in post-build artifacts like firmware and container images, and matches code snippets back to their original open-source projects <u>8</u>.

BlackDuck maintains the industry's most comprehensive database of open-source project, license, and security information, providing vulnerability alerts for existing and newly discovered security issues <a href="1011">1011</a>. The platform generates Software Bills of Materials (SBOM) and provides insights into license obligations, attribution requirements, and component health metrics <a href="811">811</a>.

# SonarQube: Code Quality and Technical Debt Analysis

SonarQube is a comprehensive code quality assurance tool that performs static analysis to identify code smells, bugs, vulnerabilities, and technical debt <u>1213</u>. The platform supports over 27 programming languages and provides continuous code quality monitoring throughout the development lifecycle <u>12</u>. SonarQube excels in measuring and tracking technical debt, calculating it based on the estimated effort required to fix all maintainability issues <u>1413</u>.

The tool offers quality gates with customizable criteria that code must meet before deployment, ensuring code quality remains within acceptable thresholds <u>1215</u>. SonarQube provides detailed metrics on code coverage, duplication percentages, complexity analysis, and compliance with coding standards <u>1216</u>.

# What These Tools Don't Do: Technical Debt and Coverage Limitations

# **Technical Debt Analysis Gaps**

While SonarQube excels at technical debt calculation and management <u>1413</u>, the other three tools have significant limitations in this area:

**TruffleHog** does not analyze technical debt at all, as it focuses exclusively on secrets detection <u>12</u>. It cannot assess code quality, maintainability issues, or provide insights into technical debt accumulation <u>17</u>.

**CheckMarx** primarily focuses on security vulnerabilities rather than code quality metrics 1816. While it identifies security-related technical debt through vulnerability detection, it doesn't measure broader technical debt related to maintainability, code complexity, or design issues 1619.

**BlackDuck** concentrates on open-source component risks and doesn't analyze proprietary code quality or technical debt <u>810</u>. It provides component health metrics but doesn't assess the technical debt of the custom code that uses these components <u>20</u>.

# **Code Coverage Analysis Limitations**

None of these four tools primarily function as dedicated code coverage analysis tools 2122:

**TruffleHog** does not perform any code coverage analysis, as its scope is limited to secrets detection across various platforms and repositories <u>13</u>.

**CheckMarx** focuses on static security analysis and does not provide traditional code coverage metrics that measure the percentage of code executed during testing <u>1615</u>. Its analysis is security-centric rather than test-coverage focused <u>18</u>.

**BlackDuck** analyzes open-source components and dependencies but does not measure how thoroughly your custom code is tested <u>810</u>. It provides component coverage in terms of dependency identification but not test execution coverage <u>20</u>.

**SonarQube** does include some code coverage reporting capabilities, but this is secondary to its primary focus on code quality and technical debt analysis <u>1223</u>. While it can display coverage metrics, it relies on external coverage tools to generate the actual coverage data 14.

# **Static Analysis Limitations Across All Tools**

All four tools share common limitations inherent to static analysis approaches 2425:

**Runtime Issue Detection**: Static analysis cannot detect runtime errors, performance problems, or issues that only manifest under specific execution conditions <u>2425</u>.

**False Positives and Negatives**: Traditional static analysis tools can produce false positives (reporting non-issues as problems) and false negatives (missing actual problems), requiring manual review and verification 1725.

**Context Limitations**: These tools analyze code as written but cannot fully account for all possible runtime scenarios or complex business logic interactions <u>2425</u>.

**Integration Complexity**: While these tools offer CI/CD integration, properly configuring and maintaining multiple scanning tools can create workflow complexity and potential slowdowns <u>25</u>.

Understanding these distinctions helps teams select the appropriate combination of tools based on their specific security, quality, and compliance requirements, recognizing that comprehensive application security and code quality often requires multiple complementary tools rather than relying on a single solution.

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# Code Security Snapshot: TruffleHog, Checkmarx, BlackDuck, and SonarQube

Navigating the landscape of code security and quality tools can be complex. Understanding the specific roles of tools like TruffleHog, Checkmarx, BlackDuck, and SonarQube is crucial for a comprehensive security posture. While each tool offers unique scanning capabilities, they also have limitations, particularly concerning overall code technical debt and test coverage.

## What They Do Individually

Here's a breakdown of the primary functions of each tool:

## TruffleHog: The Secrets Detective 🕵

TruffleHog is a highly specialized tool focused exclusively on **detecting secrets** such as API keys, private keys, and other credentials accidentally committed in your code repositories. 

It scours the entire commit history, ensuring no sensitive information is left exposed. 

2

## Checkmarx: The All-in-One Security Guard 🔍

Checkmarx offers a comprehensive suite of Application Security Testing (AST) tools. Its core functionalities include:

- Static Application Security Testing (SAST): Analyzes your source code for security vulnerabilities without executing it.
- Dynamic Application Security Testing (DAST): Tests your running application for vulnerabilities from the outside.
- Software Composition Analysis (SCA): Identifies vulnerabilities and license compliance issues in your open-source dependencies.
- Interactive Application Security Testing (IAST): Combines elements of SAST and DAST for more accurate vulnerability detection in running applications.

# BlackDuck: The Open-Source Librarian 📚

BlackDuck is primarily a **Software Composition Analysis (SCA)** tool. <sup>7</sup> It excels at:

- Identifying all open-source components within your applications.
- Flagging known vulnerabilities in those open-source libraries.
- Ensuring compliance with open-source licenses to avoid legal issues.

## SonarQube: The Code Quality & Health Inspector 🔾

SonarQube is a platform for continuous inspection of code quality and security. <sup>9</sup> It helps you:

- Identify "code smells," which are indicators of deeper issues in your code that can lead to bugs.
- •
- Measure code complexity to ensure maintainability.
- Detect duplicate code to keep your codebase clean.
- Perform static application security testing (SAST) to find security vulnerabilities.
- Track and manage technical debt by providing metrics and grades on your code's health.

•

### What They Don't Do: The Gaps in Coverage

While powerful, these tools are not a silver bullet for all aspects of software quality. A significant area where they have limitations is in the direct measurement and management of all facets of code technical debt and code coverage.

#### **Code Technical Debt:**

While SonarQube directly addresses technical debt from a code quality perspective and security tools like Checkmarx and BlackDuck identify security-related debt, none of these tools provide a complete picture on their own. A holistic view of technical debt also includes architectural flaws, poor design decisions, and inefficient algorithms that these tools may not be designed to assess comprehensively. For instance, a piece of code might be secure and have no "smells" but could be architecturally unsound, leading to future maintenance nightmares.

#### **Code Coverage:**

**TruffleHog, Checkmarx, and BlackDuck do not measure code coverage.** Their focus is on security vulnerabilities and component analysis, not on the extent to which your tests exercise your codebase.

**SonarQube** is the only tool in this list that **reports on code coverage**, but it **does not generate this data itself.** It relies on integrating with external unit testing and code coverage tools (like JaCoCo for Java or Coverage.py for Python) to visualize the results. Therefore, you still need to implement a robust testing strategy and the necessary tools to generate coverage data.

In essence, while these four tools are essential for securing your software and improving its quality, they must be complemented by a strong testing culture and potentially other tools to gain a complete understanding of your project's overall health, including its architectural integrity and the thoroughness of its test suite.

### **Key Points**

- Research suggests TruffleHog focuses on finding secrets in code, not technical debt or coverage.
- It seems likely Checkmarx scans for security vulnerabilities, with limited focus on technical debt or coverage.
- The evidence leans toward Black Duck managing open source risks, not directly addressing technical debt or coverage.
- SonarQube appears best for code quality, directly handling technical debt and test coverage.

## **Tool Comparison Overview**

#### What Each Tool Does Individually

- **TruffleHog**: Primarily scans source code, especially Git repositories, to find secrets like API keys and credentials, focusing on security to prevent data leaks.
- **Checkmarx**: Performs Static Application Security Testing (SAST) to identify security vulnerabilities in source code, aiming to catch issues early in development.
- **Black Duck**: Focuses on Software Composition Analysis (SCA), identifying open source components and checking for vulnerabilities and license compliance.
- **SonarQube**: Analyzes code quality, detecting bugs, vulnerabilities, and code smells, while also managing technical debt and providing test coverage metrics.

#### **Technical Debt and Coverage**

- None of TruffleHog, Checkmarx, or Black Duck directly address technical debt or test coverage; they focus on security aspects.
- SonarQube is unique in directly tackling technical debt (e.g., code smells, duplications) and providing test coverage metrics, integrating with tools like JaCoCo for detailed reports.

#### Language, Integration, and Reporting

- All tools support multiple languages, with Checkmarx covering 75+ and SonarQube 30+ (36 in Enterprise).
- They integrate with CI/CD tools like Jenkins and GitHub, with SonarQube and Checkmarx offering broad IDE support.
- Reports vary: TruffleHog lists secrets, Checkmarx details vulnerabilities, Black Duck covers open source risks, and SonarQube offers comprehensive code quality insights.

Survey Note: Detailed Comparison of TruffleHog, Checkmarx, Black Duck, and SonarQube

This note provides an in-depth analysis of TruffleHog, Checkmarx, Black Duck, and SonarQube, focusing on their individual functionalities, particularly in relation to code technical debt and coverage. It also covers language support, integration support, and report types, ensuring a comprehensive comparison for users interested in both security and code quality aspects.

#### **Individual Functionalities**

#### **TruffleHog**

TruffleHog is designed to identify secrets in source code, particularly in Git repositories. It scans for sensitive information such as API keys, credentials, and passwords that might have been accidentally committed, focusing on preventing data leaks. As of recent updates, it is a security tool that does not directly address code technical debt or test coverage, but by ensuring no secrets are left in the codebase, it indirectly contributes to maintaining a cleaner and more secure codebase, which can reduce future maintenance issues. Its primary focus is on security, with capabilities to scan beyond code repositories, including comments, Docker images, and more, as seen in its enterprise features



#### Checkmarx

Checkmarx is a Static Application Security Testing (SAST) tool that scans source code for security vulnerabilities. It aims to identify potential security issues early in the software development lifecycle (SDLC) to prevent them from reaching production. While it does not explicitly address technical debt or test coverage, it indirectly contributes to reducing technical debt by identifying security vulnerabilities that, if unaddressed, could lead to maintenance challenges. Its focus is on security, with support for 75+ programming languages and frameworks, making it versatile for diverse codebases



#### **Black Duck**

Black Duck is a Software Composition Analysis (SCA) tool that identifies open source components in a codebase and checks for known vulnerabilities and license compliance. It helps manage the risks associated with using third-party libraries, focusing on security and compliance rather than code quality. It does not directly address technical debt or test coverage, but by ensuring open source components are secure and compliant, it indirectly helps reduce potential future issues that could contribute to technical debt. It supports a

broad range of languages for open source component detection, though specific numbers are not detailed in recent documentation.

#### SonarQube

SonarQube is a code quality tool that performs static code analysis to detect bugs, vulnerabilities, code smells, and duplications. It also provides metrics on code coverage and helps manage technical debt by identifying areas of complexity and poor code quality. Unlike the other tools, SonarQube directly addresses technical debt through metrics on code smells (e.g., complex methods, duplicated code), bugs, and vulnerabilities, offering actionable insights to reduce it over time. It explicitly supports test coverage metrics by integrating with third-party coverage tools like JaCoCo for Java and Istanbul for JavaScript, displaying coverage data alongside other code quality metrics



. It supports 30+ programming languages in its Developer Edition and 36 in its Enterprise/Data Center Edition, including Java, C#, C++, JavaScript, Python, and Go.

#### **Technical Debt and Coverage Analysis**

Technical debt refers to the implied cost of additional rework caused by choosing an easy solution now instead of using a better approach that would take longer, including code smells, duplications, and complexity that make the code harder to maintain. Test coverage measures how much of the code is covered by tests, ensuring adequacy in testing efforts.

- **TruffleHog**: Does not provide explicit metrics for technical debt or test coverage. Its focus is on security, specifically finding secrets, which indirectly helps maintain a cleaner codebase but does not address code quality metrics.
- Checkmarx: Does not explicitly address technical debt or test coverage. Its focus is
  on security vulnerabilities, which can contribute to technical debt if not addressed, but
  it lacks direct metrics for code quality or testing adequacy.
- Black Duck: Similarly, Black Duck does not provide explicit metrics for technical debt or test coverage. It focuses on open source risks, which can indirectly affect technical debt if vulnerabilities are present, but its primary goal is security and compliance.
- SonarQube: Stands out by directly addressing technical debt through identifying
  code smells, duplications, and complexity, providing metrics and trends to help teams
  prioritize and reduce technical debt. It also explicitly supports test coverage,
  integrating with coverage tools to import and display coverage data, making it the
  only tool among the four to handle both aspects comprehensively.

#### Language, Integration, and Reporting Details

#### Language Support

 TruffleHog: As a tool for secret detection, TruffleHog is language-agnostic, scanning for patterns in text files, making it capable of handling repositories in any programming language. It is written in Go, but this does not limit its scanning capabilities.

- Checkmarx: Supports 75+ programming languages and frameworks, offering extensive coverage for diverse codebases, as mentioned in its developer experience solutions.
- Black Duck: Supports a broad range of languages for open source component detection, though specific numbers are not detailed in recent overviews. Its focus is on identifying dependencies across various languages, ensuring comprehensive SCA.
- SonarQube: Supports 30+ languages in its Developer Edition and 36 in its
  Enterprise/Data Center Edition, with detailed lists including Java, C#, C++,
  JavaScript, Python, Go, and infrastructure as code (IaC) languages like Terraform

#### **Integration Support**

• **TruffleHog**: Integrates with platforms like GitHub, GitLab, Docker, S3, GCS, Circle CI, Travis CI, Postman, Jenkins, Elasticsearch, and Hugging Face. Its enterprise version also monitors tools like Jira, Slack, Confluence, Microsoft Teams, and Sharepoint, available as a GitHub Action and pre-commit hook, with documentation at .

- Checkmarx: Offers simple integrations into every pipeline and IDE, with support for a
  broad set of SCM and CI/CD tools, including Jenkins, Bamboo, and version control
  systems like GitHub and GitLab. It also supports various security tools like SAST,
  DAST, API Security, and SCA, as detailed in its DevSecOps solutions.
- Black Duck: Integrates across the SDLC and CI/CD pipelines, offering developer-friendly solutions, with support for tools like GitHub Actions, GitLab CI/CD, Azure Pipelines, and Jenkins, ensuring seamless integration without impeding development.
- **SonarQube**: Integrates with popular CI/CD tools like GitHub Actions, GitLab CI/CD, Azure Pipelines, Bitbucket Pipelines, and Jenkins, as well as IDEs like Eclipse,

IntelliJ, and Visual Studio, enhancing its usability in development workflows

#### **Report Types**

- **TruffleHog**: Generates reports on found secrets, including the type of secret (e.g., API key, password), its location in the code, and verification status, helping teams prioritize remediation efforts .
- Checkmarx: Produces reports on security vulnerabilities, including their severity, location in the code, and remediation guidance, aiding developers in fixing issues efficiently.
- Black Duck: Creates reports on open source components, including license information, known vulnerabilities, and compliance status, ensuring teams can manage risks associated with third-party libraries

• **SonarQube**: Provides detailed reports on code quality, including bugs, vulnerabilities, code smells, duplications, test coverage, and trends over time, offering dashboards

for visualizing code health and aiding in continuous improvement



#### **Comparative Table**

Below is a table summarizing the key aspects for easy comparison:

Aspect	TruffleHog	Checkmarx	Black Duck	SonarQube
Primary Focus	Finding secrets in code	SAST for security vulnerabilities	SCA for open source risks	Code quality, technical debt, coverage
Technical Debt	Indirectly, via security	Indirectly, via vulnerabilities	Indirectly, via open source risks	Directly, via code smells, duplications
Test Coverage	No	No	No	Yes, integrates with coverage tools
Language Support	Language-agno stic for secrets	75+ languages and frameworks	Broad range, specifics not detailed	30+ (36 in Enterprise) languages
Integration	GitHub, GitLab, CI/CD, enterprise tools	CI/CD, IDEs, SCM, security tools	SDLC, CI/CD, developer tools	CI/CD, IDEs, version control systems
Report Types	Secrets found, location, verification	Vulnerabilities, severity, remediation	Open source, licenses, vulnerabilities	Code quality, bugs, coverage, trends

#### **Conclusion and Recommendations**

For users primarily interested in managing code technical debt and ensuring test coverage, **SonarQube** is the most suitable tool. It directly addresses these aspects by providing metrics on code smells, duplications, complexity, and test coverage, integrating with tools like JaCoCo for detailed reports. However, for a comprehensive security strategy, consider:

- TruffleHog for detecting secrets in your codebase, especially in Git repositories.
- Checkmarx for identifying security vulnerabilities in source code through SAST.
- **Black Duck** for managing open source component risks and ensuring license compliance.

Each tool has strengths in language support, with Checkmarx covering 75+ languages and SonarQube supporting 30+ (36 in Enterprise). Integration capabilities are robust across all, with SonarQube and Checkmarx offering particularly broad support for CI/CD and IDEs.

Reports vary by focus, with SonarQube providing the most comprehensive insights into code quality and coverage.

Depending on specific needs, a combination of these tools might be beneficial. For example, for a project with heavy open source usage, pair Black Duck with SonarQube for both security and quality. For security-focused teams, TruffleHog and Checkmarx could complement each other for secret detection and vulnerability scanning.