

Transforming Mortgage Operations with AI-powered **Intelligent Document Processing**

Presented by 

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Housing & Mortgage Industry





Amazon Web Services is the world's most comprehensive and broadly adopted cloud, enabling customers to **build anything they can imagine**.

We offer **the greatest choice of innovative cloud capabilities and expertise**, on the most extensive global infrastructure with industry-leading security, reliability, and performance.

<https://aws.amazon.com/what-is-aws/>



With **the most comprehensive set of AI services,** tools, and resources, AWS brings deep expertise to **over 100,000 customers** to meet the demands of their business and unlock the value of their data.

<https://aws.amazon.com/ai/>

Agenda

- The cost of document processes:
Time, Complexity & Money
- Modernization opportunities
- Technology solution overview:
Intelligent Document Processing (IDP)
- End-to-end IDP with AI Agents
- Deploying modern AI solutions

The cost of document processes: *Time, Complexity & Money*

The cost of document processes:

Time, Complexity & Money

Loan Process Input Documents



Proof of Income

Credit Reports

Employment Verification

Assets & Debts Statements

Property & Appraisal Docs

W2, 1040, 1099, 4506-C, etc

Identity Documents

Loan Application Docs

... and many other doc types/variants



The cost of document processes:

Time, Complexity & Money



*Structured
and
Unstructured
Documents*

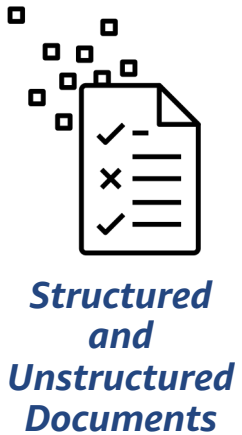


L
E
G
A
C
Y



The cost of document processes:

Time, Complexity & Money



L
E
G
A
C
Y

Classify & Split Docs



Extract Data

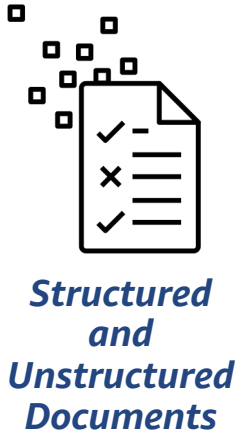
- Doc type
- Page ranges
- Reorder

- Key:Value text
- Entity type
- Bounding box
- Conf score

Document overload, ...

The cost of document processes:

Time, Complexity & Money



L
E
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C
Y

Classify & Split Docs

- Doc type
- Page ranges
- Reorder



Extract Data

- Key:Value text
- Entity type
- Bounding box
- Conf score



Normalize Fields

- Normalized key
- Normalized vals
- Parsing



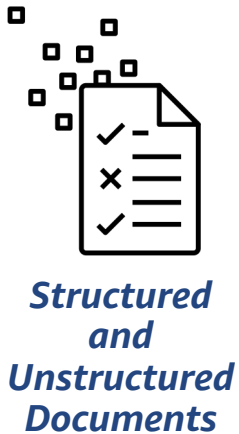
Validate Form Quality

- Completeness
- Invalid type/form
- Inconsistency

Document overload, human error, ...

The cost of document processes:

Time, Complexity & Money



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Y

Classify & Split Docs

- Doc type
- Page ranges
- Reorder



Extract Data

- Key:Value text
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- Normalized vals
- Parsing



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- Completeness
- Invalid type/form
- Inconsistency



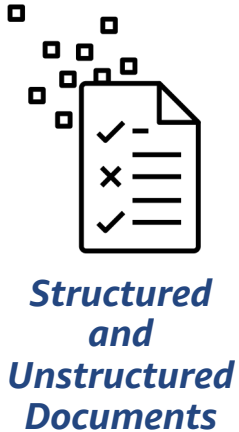
Verify & Confirm

- Cross-doc variances
- Sparse disclosure
- Misrepresentations
- Suspect (meta)data

Document overload, human error, inconsistent decision-making, etc.

The cost of document processes:

Time, Complexity & Money



LEGACY

Classify & Split Docs

- Doc type
- Page ranges
- Reorder



Extract Data

- Key:Value text
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Normalize Fields

- Normalized key
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Validate Form Quality

- Completeness
- Invalid type/form
- Inconsistency



Verify & Confirm

- Cross-doc variances
- Sparse disclosure
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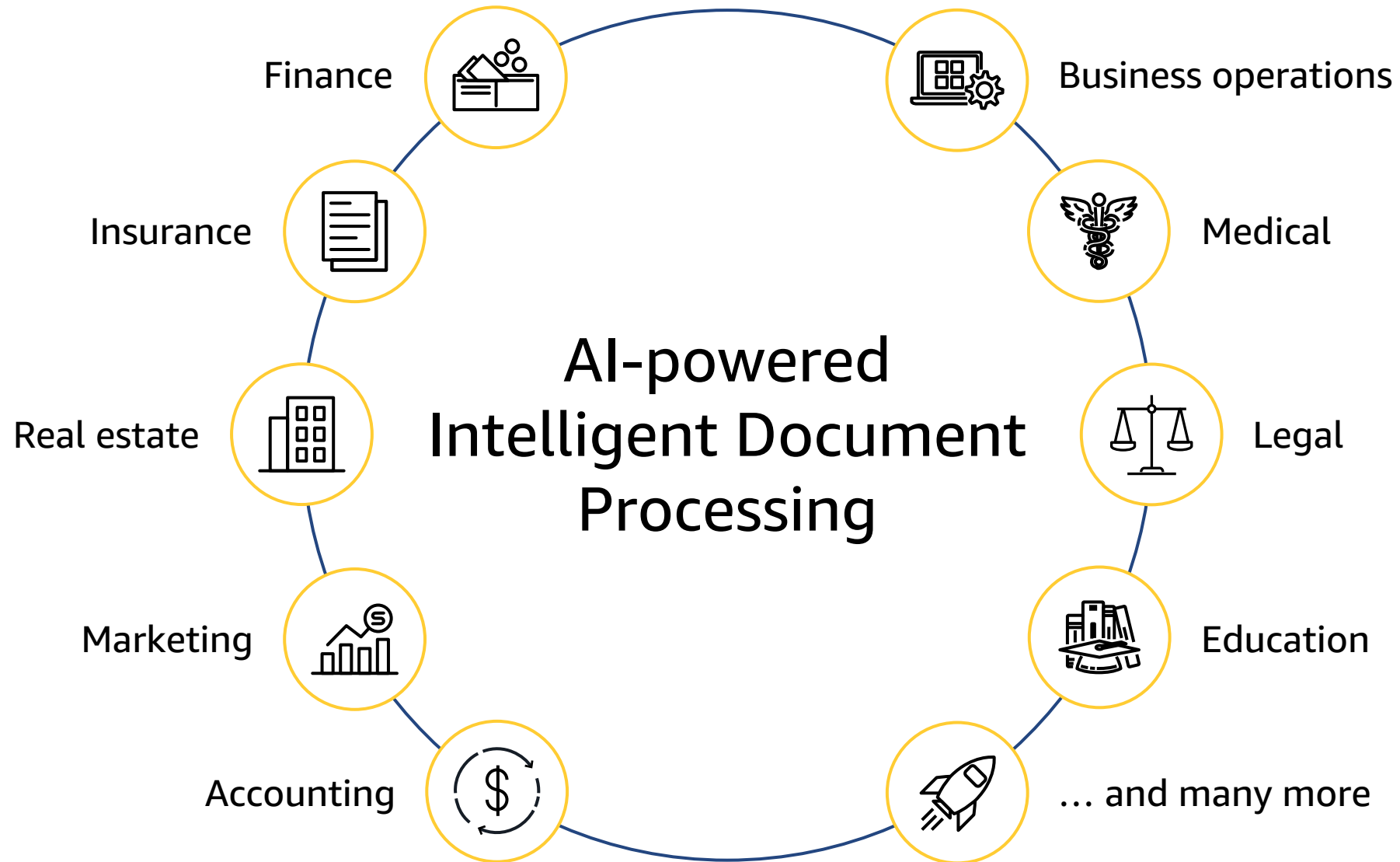
Document overload, human error, inconsistent decision-making, etc.

Scaling challenges result in painful **backlogs & costly errors**.

Modernization opportunities: *Automation & Optimization with AI*



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Modernization opportunities:

Automation & Optimization with AI

According to a Fannie Mae survey of senior mortgage executives in 2023:

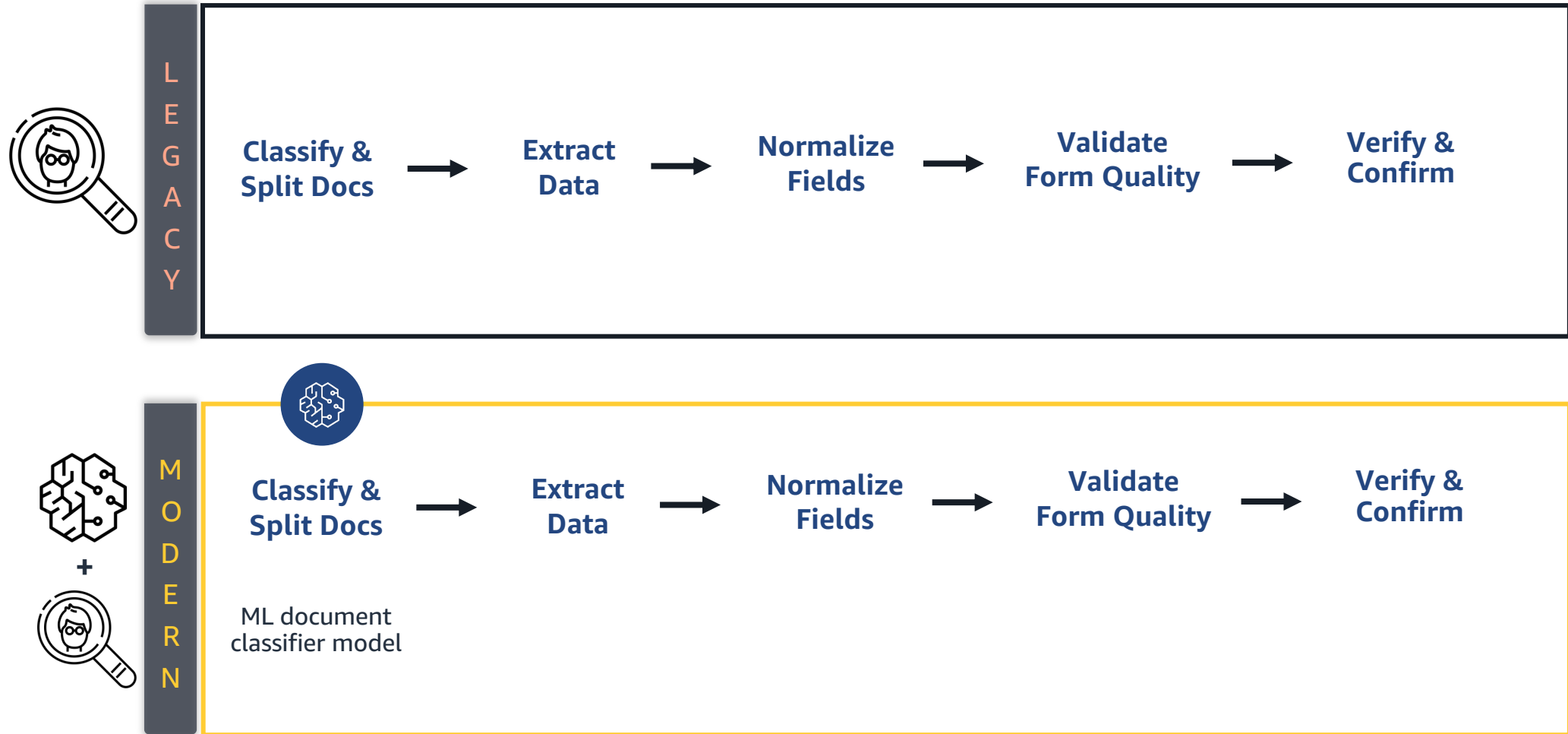
65% of lenders in 2023 report that they are familiar with AI/ML technology, but **only 7%** said they have deployed AI/ML.

<https://www.fanniemae.com/research-and-insights/perspectives/lenders-motivation-ai-adoption> (2023)

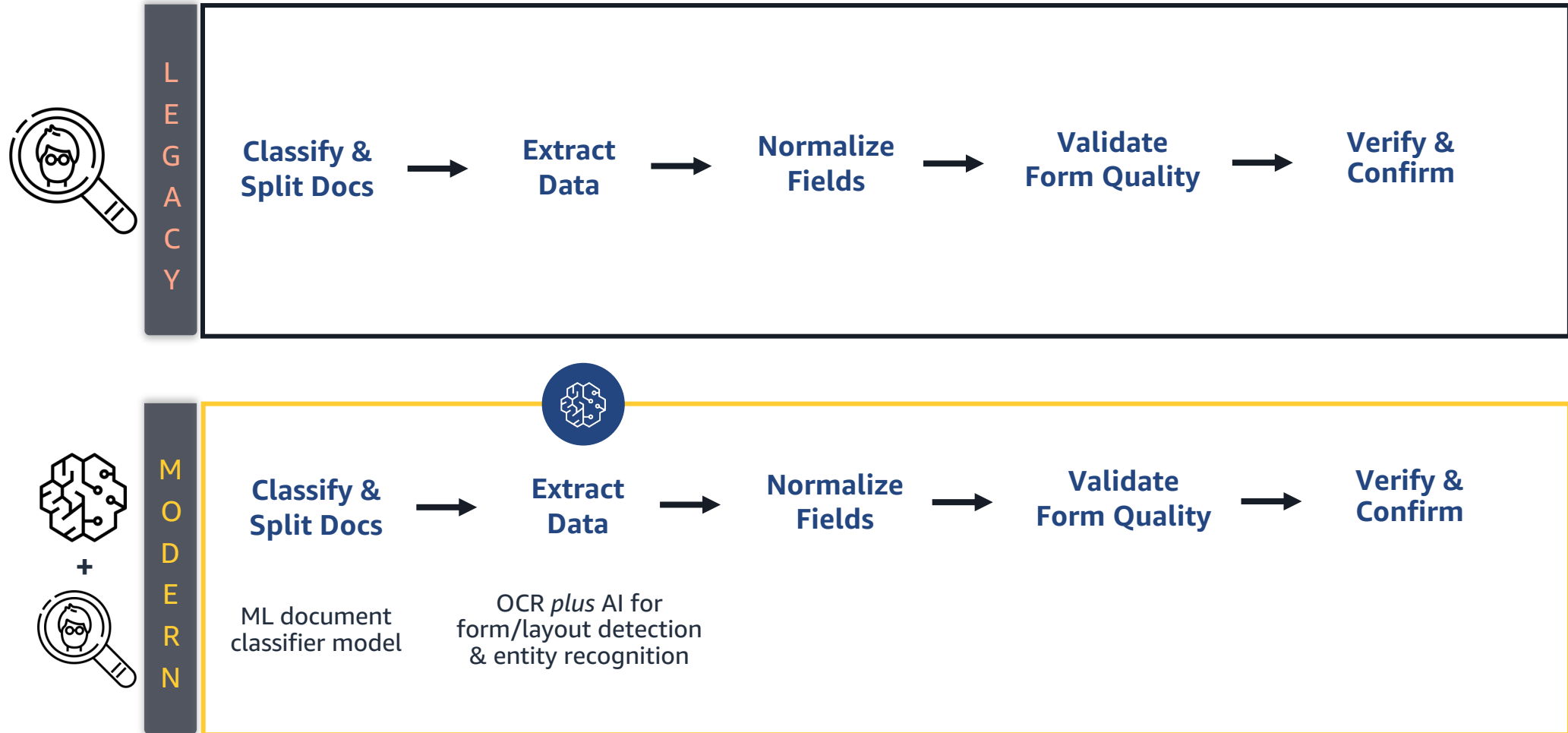


Modernization opportunities:

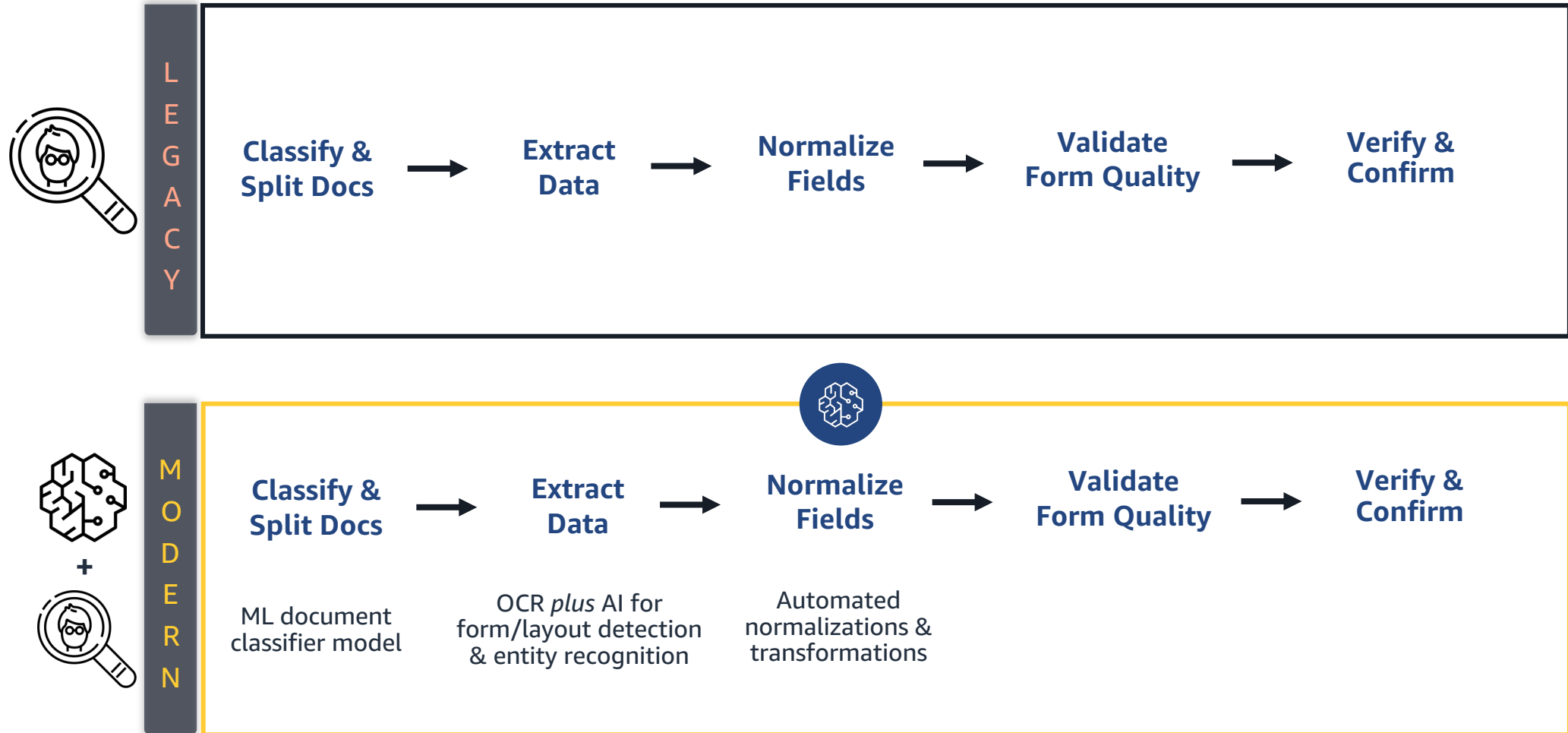
Automation & Optimization with AI



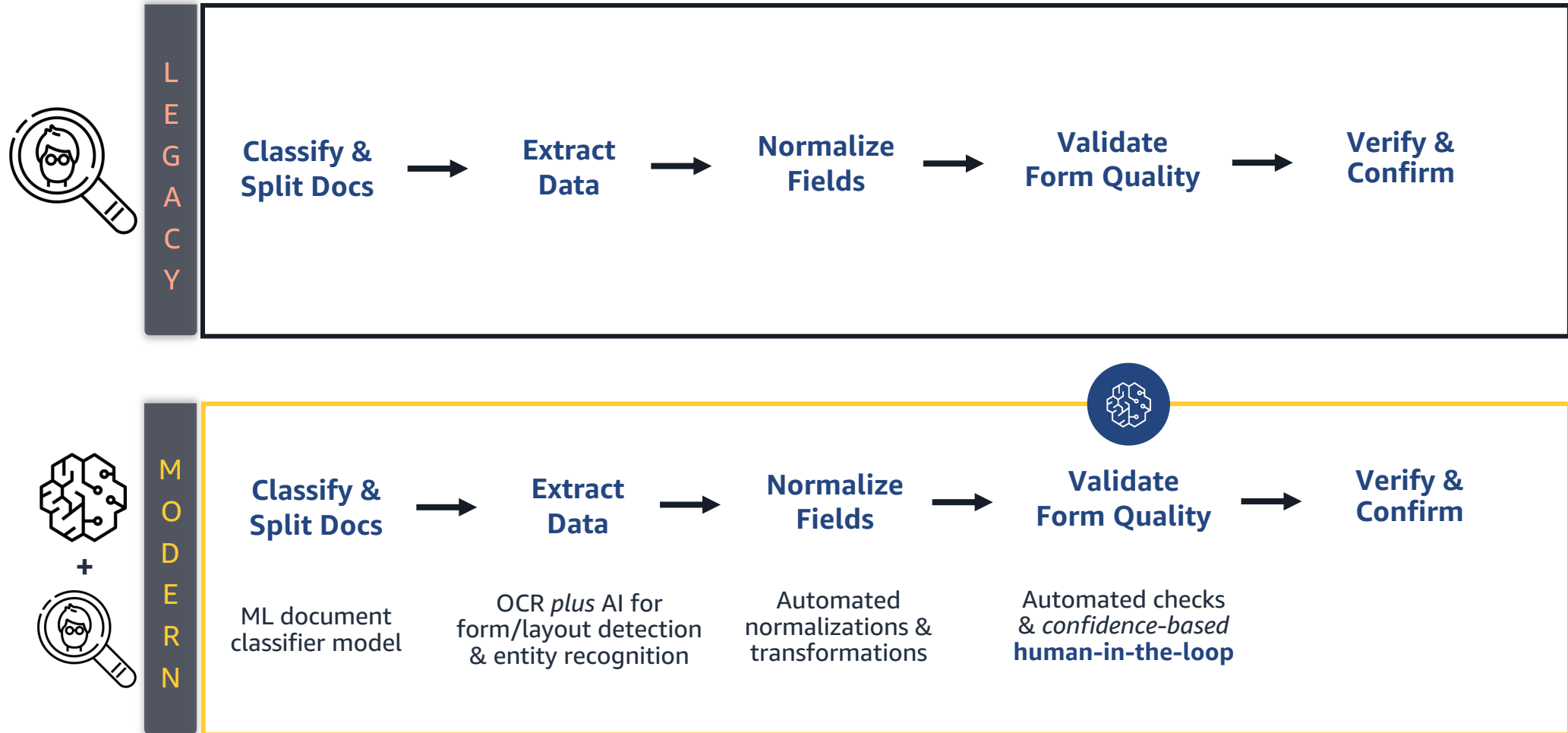
Modernization opportunities: *Automation & Optimization with AI*



Modernization opportunities: *Automation & Optimization with AI*



Modernization opportunities: *Automation & Optimization with AI*



Modernization opportunities: *Automation & Optimization with AI*



L
E
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**Classify &
Split Docs**



**Extract
Data**



**Normalize
Fields**



**Validate
Form Quality**



**Verify &
Confirm**



+



M
O
D
E
R
N

**Classify &
Split Docs**



**Extract
Data**



**Normalize
Fields**



**Validate
Form Quality**



**Verify &
Confirm**

ML document
classifier model

OCR *plus* AI for
form/layout detection
& entity recognition

Automated
normalizations &
transformations

Automated checks
& *confidence-based*
human-in-the-loop

Automated complex task
decisioning & execution
with Gen AI powered
AI Agents



Modernization opportunities:

Automation & Optimization with AI

According to a top U.S. mortgage technology provider:

“Using AWS AI services like Amazon Textract has provided us a way to further automate the underwriting process for our clients, **reducing their manual reviews of documents by up to 4 hours.**

This saves their employees' time all while improving the mortgage experience to their customers.”

<https://aws.amazon.com/blogs/machine-learning/aws-is-redefining-how-companies-process-documents-in-a-digital-world/> (2021)

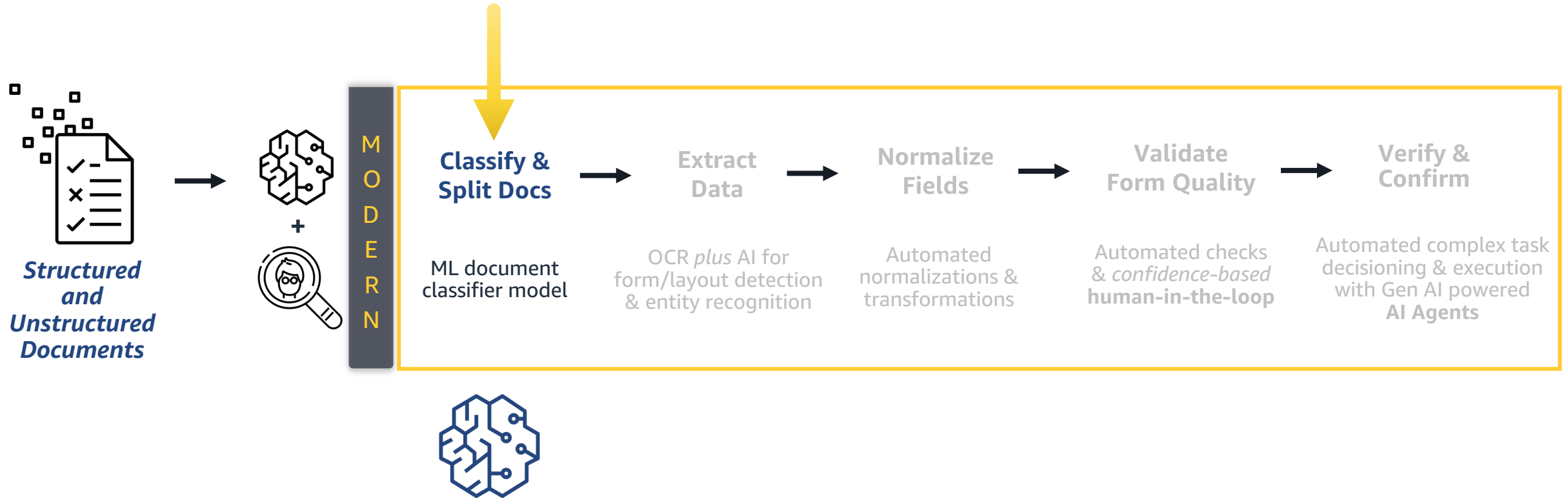


Technology solution overview: *Intelligent Document Processing (IDP)*



Technology solution overview:

Intelligent Document Processing – Classification



Technology solution overview:

Intelligent Document Processing – Classification

Loan Process Docs

Proof of Income

Credit Reports

Employment Verification

Assets & Debts Statements

Property & Appraisal Docs

W2, 1040, 1099, 4506-C, etc

Identity Documents

Loan Application Docs

... and many other documents



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Intelligent Document Processing – Classification

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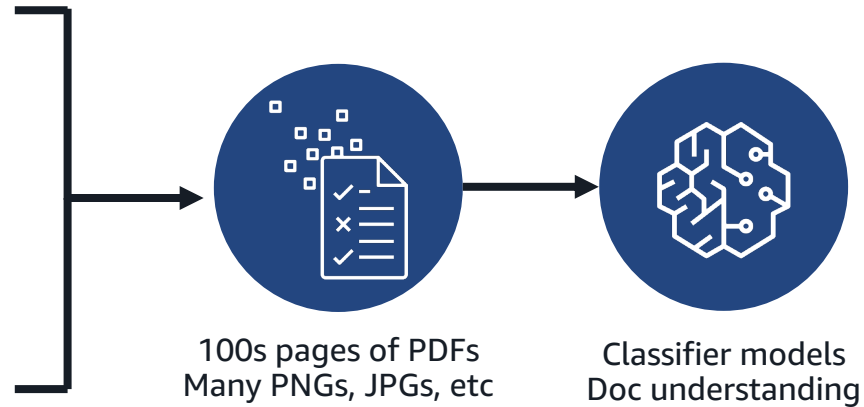
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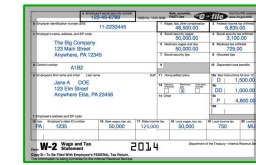
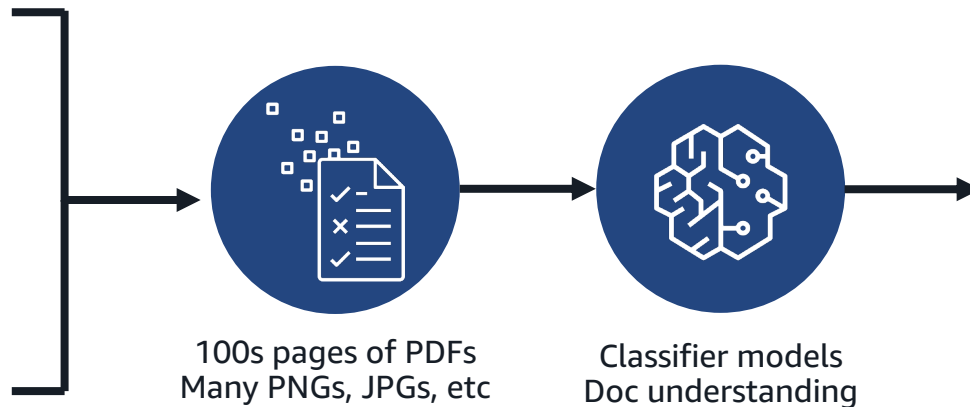
Property & Appraisal Docs

W2, 1040, 1099, 4506-C, etc

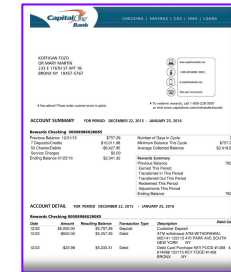
Identity Documents

Loan Application Docs

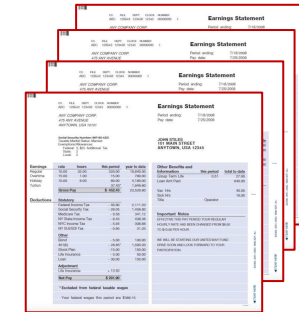
... and many other documents



W2



Bank
Statement



Payslips



IDs

For each page:

Infer if there are parts of multiple documents on the page.
Predict the likely document types.

Infer groupings of documents spanning multiple pages.



Technology solution overview:

Intelligent Document Processing – Classification

Loan Process Docs

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Assets & Debts Statements

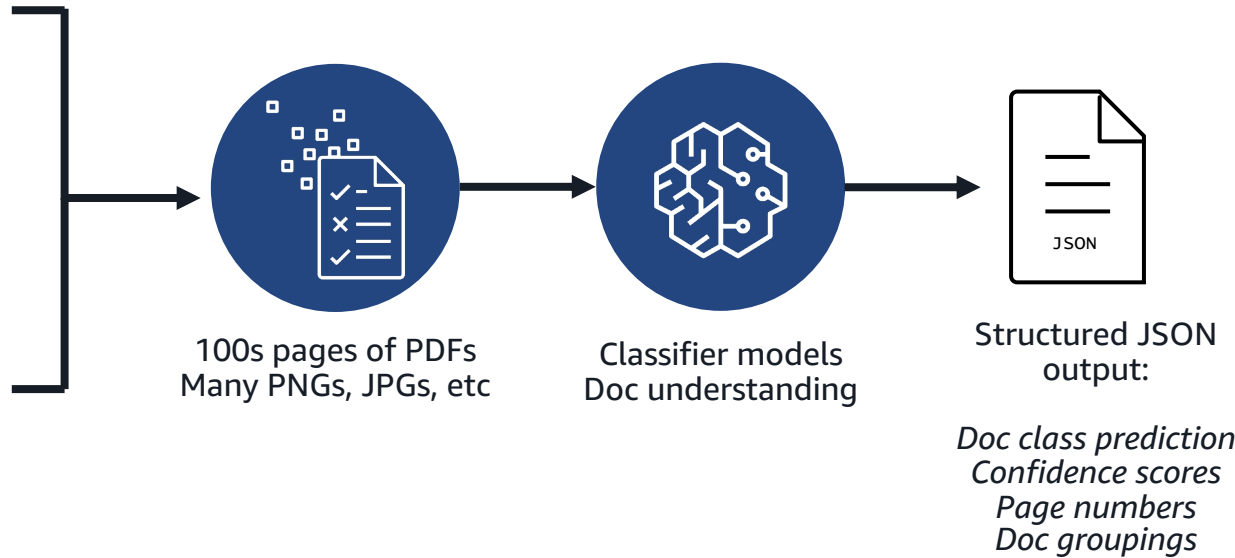
Property & Appraisal Docs

W2, 1040, 1099, 4506-C, etc

Identity Documents

Loan Application Docs

... and many other documents

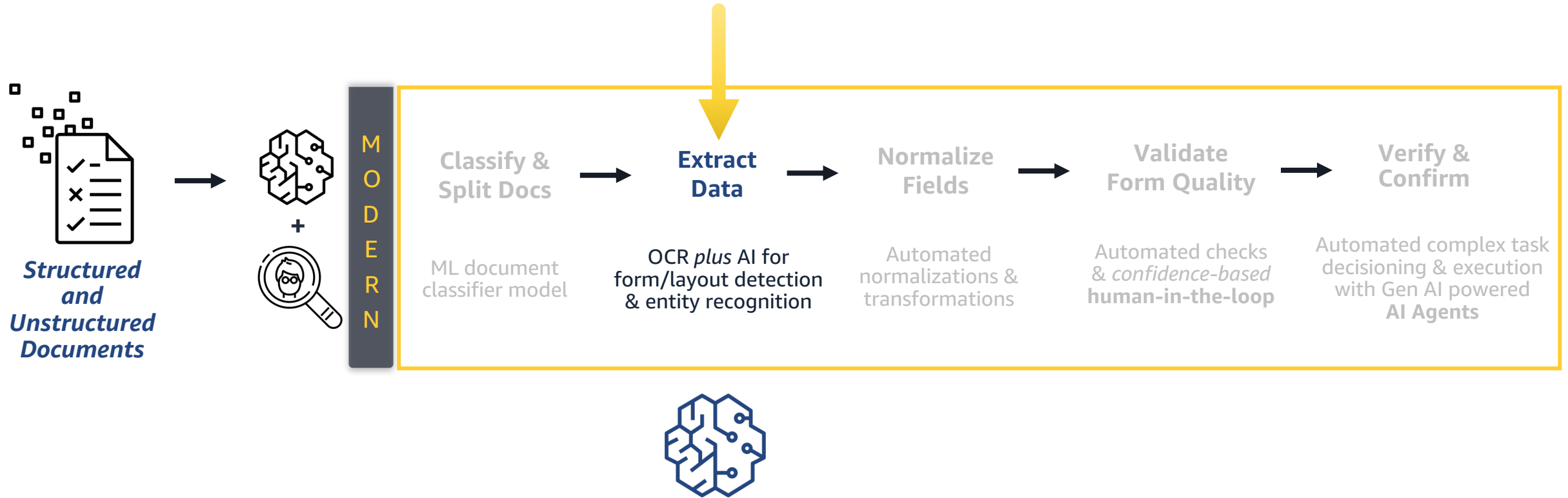


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    }
  }
  ...
]
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    "Index": 2,
    "Pages": [7,8,9]
  },
  ...
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    "Type": "PAYSLIPS",
    "Index": 1,
    "Pages": [5,6]
  },
  ...
]
```

Technology solution overview:

Intelligent Document Processing – Extraction



Technology solution overview:

Intelligent Document Processing – Extraction

CO. FILE DEPT. CLOCK NUMBER
ABC 126543 123456 12345 00000000 1

ANY COMPANY CORP.
475 ANY AVENUE
ANYTOWN, USA 10101

Social Security Number: 987-65-4321
Taxable Marital Status: Married
Exemptions/Allowances:

Federal: 3, \$25 Additional Tax
State: 2
Local: 2

Earnings Statement

Period ending: 7/18/2008
Pay date: 7/25/2008

JOHN STILES
101 MAIN STREET
ANYTOWN, USA 12345

Earnings	rate	hours	this period	year to date
Regular	10.00	32.00	320.00	16,640.00
Overtime	15.00	1.00	15.00	780.00
Holiday	10.00	8.00	80.00	4,160.00
Tuition			37.43*	1,946.80
			Gross Pay	\$ 452.43
				23,526.80

Deductions	Statutory		
	Federal Income Tax	- 40.60	2,111.20
	Social Security Tax	- 28.05	1,458.60
	Medicare Tax	- 6.56	341.12
	NY State Income Tax	- 8.43	438.36
	NYC Income Tax	- 5.94	308.88
	NY SUI/SDI Tax	- 0.60	31.20
	Other		
	Bond	- 5.00	100.00
	401(k)	- 28.85*	1,500.20
	Stock Plan	- 15.00	150.00
	Life Insurance	- 5.00	50.00
	Loan	- 30.00	150.00

Adjustment

Life Insurance + 13.50

Net Pay \$ 291.90

* Excluded from federal taxable wages

Your federal wages this period are \$386.15

Other Benefits and Information	this period	total to date
Group Term Life	0.51	27.00
Loan Amt Paid		840.00
Vac Hrs		40.00
Sick Hrs		16.00
Title	Operator	

Important Notes

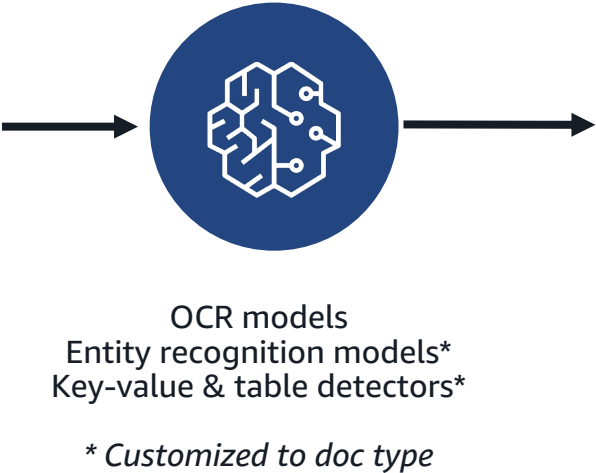
EFFECTIVE THIS PAY PERIOD YOUR REGULAR
HOURLY RATE HAS BEEN CHANGED FROM \$8.00
TO \$10.00 PER HOUR.

WE WILL BE STARTING OUR UNITED WAY FUND
DRIVE SOON AND LOOK FORWARD TO YOUR
PARTICIPATION.

©2006, 2001, 2000, 1999 ADP - Inc.

▼ TEAR HERE

Payslip document



Technology solution overview:

Intelligent Document Processing – Extraction

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ABC 126543 123456 12345 00000000 1

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475 ANY AVENUE
ANYTOWN, USA 10101

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Other			
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Stock Plan	- 15.00		150.00
Life Insurance	- 5.00		50.00
Loan	- 30.00		150.00
Adjustment			
Life Insurance	+ 13.50		
Net Pay			\$ 291.90

* Excluded from federal taxable wages

Your federal wages this period are \$386.15

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this period total to date

Group Term Life 0.51 27.00

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Sick Hrs 16.00

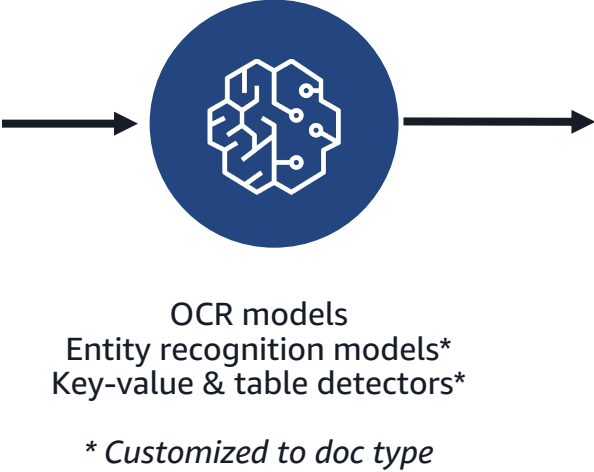
Title Operator

Important Notes

EFFECTIVE THIS PAY PERIOD YOUR REGULAR HOURLY RATE HAS BEEN CHANGED FROM \$8.00 TO \$10.00 PER HOUR.

WE WILL BE STARTING OUR UNITED WAY FUND DRIVE SOON AND LOOK FORWARD TO YOUR PARTICIPATION.

Payslip document



Pay Period (key-value)	
Period ending	= "7/18/2008"
Pay date	= "7/25/2008"
Earnings (table)	
Regular, rate	= 10.00
Regular, hours	= 32.00
Regular, period gross	= 320.00
Regular, YTD gross	= 16,640.00
Overtime, rate	= 15.00
...	
Deductions (table)	
Federal income tax	= -40.60
Social security tax	= -28.05
Net Pay (key-value)	
Net pay this period	= \$291.90
Name (key entity)	= "JOHN STILES"
St Address (key entity)	= 101 MAIN STREET
...	

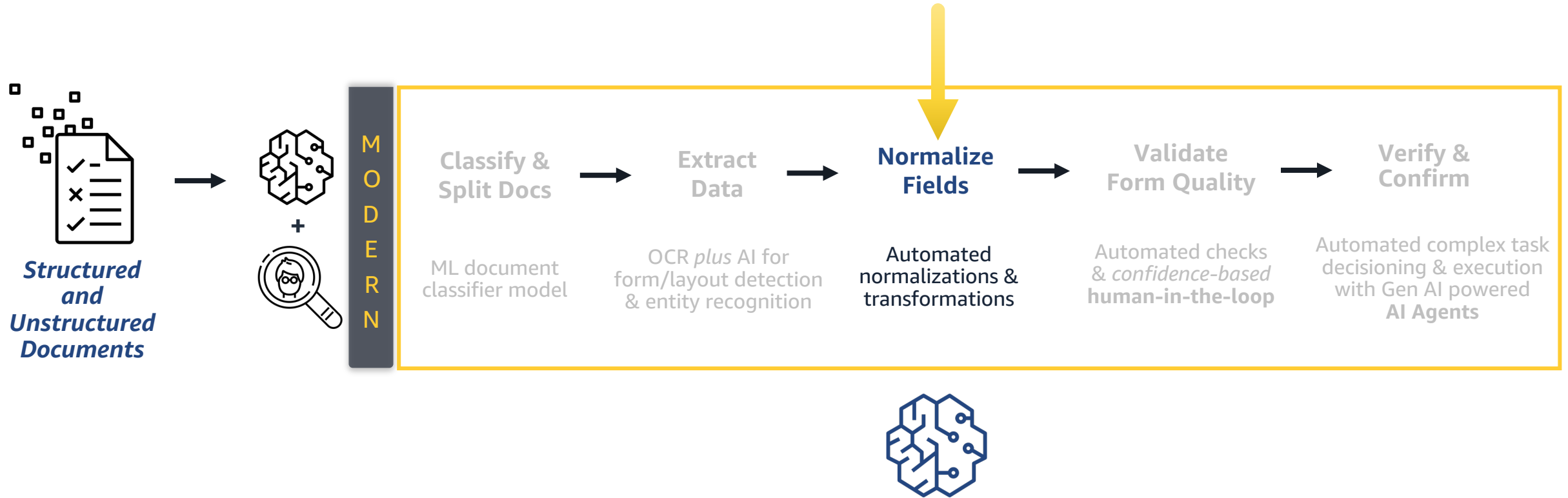
For each document type:

Extracted **particular** data elements
... based on that document type's **specific schema & entities**
... with understanding of **document structures**.



Technology solution overview:

Intelligent Document Processing – Normalize & Transform



Technology solution overview:

Intelligent Document Processing – Normalize & Transform

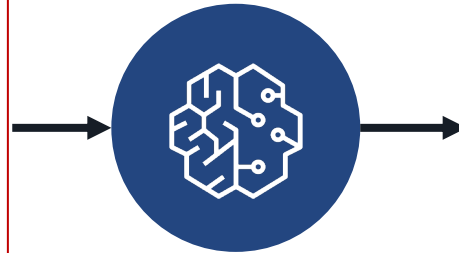
Pay Period (key-value)
Period ending = "7/18/2008"
Pay date = "7/25/2008"

Earnings (table)
Regular, rate = 10.00
Regular, hours = 32.00
Regular, period gross = 320.00
Regular, YTD gross = 16,640.00
Overtime, rate = 15.00
...

Deductions (table)
Federal income tax = -40.60
Social security tax = -28.05

Net Pay (key-value)
Net pay this period = \$291.90

Name (key entity) = "JOHN STILES"
St Address (key entity) = 101 MAIN STREET
...



Normalization pipeline
Custom transform pipeline

Technology solution overview:

Intelligent Document Processing – Normalize & Transform

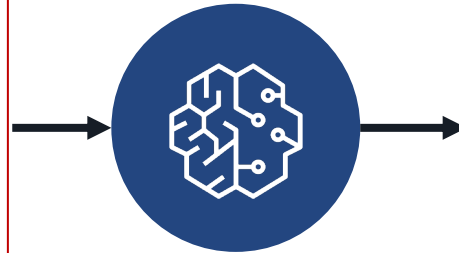
Pay Period (key-value)
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Regular, rate = 10.00
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Overtime, rate = 15.00
...

Deductions (table)
Federal income tax = -40.60
Social security tax = -28.05

Net Pay (key-value)
Net pay this period = \$291.90

Name (key entity) = "JOHN STILES"
St Address (key entity) = 101 MAIN STREET
...



Normalization pipeline
Custom transform pipeline

Pay Period (key-value)
Period ending = "7/18/2008" -> **pay_end**
Pay date = "7/25/2008" -> **pay_date**

Earnings (table)
Regular, rate = 10.00 -> ...
Regular, hours = 32.00 -> ...
Regular, period gross = 320.00 -> ...
Regular, YTD gross = 16,640.00 -> ...
Overtime, rate = 15.00 -> ...
...

Deductions (table)
Federal income tax = -40.60 -> **fed_inc_tax**
Social security tax = -28.05 -> **ss_tax**

Net Pay (key-value)
Net pay this period = \$291.90 -> **net_pay**

Name (key entity) = "JOHN STILES" -> **name**

St Address (key entity) = 101 MAIN STREET -> ...
...

Technology solution overview:

Intelligent Document Processing – Normalize & Transform

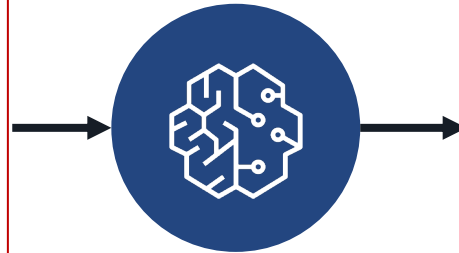
Pay Period (key-value)
Period ending = "7/18/2008"
Pay date = "7/25/2008"

Earnings (table)
Regular, rate = 10.00
Regular, hours = 32.00
Regular, period gross = 320.00
Regular, YTD gross = 16,640.00
Overtime, rate = 15.00
...

Deductions (table)
Federal income tax = -40.60
Social security tax = -28.05

Net Pay (key-value)
Net pay this period = \$291.90

Name (key entity) = "JOHN STILES"
St Address (key entity) = 101 MAIN STREET
...



Normalization pipeline
Custom transform pipeline

Pay Period (key-value)
Period ending = "7/18/2008" -> pay_end = "2008-07-18"
Pay date = "7/25/2008" -> pay_date = "2008-07-25"

Earnings (table)
Regular, rate = 10.00 -> ...
Regular, hours = 32.00 -> ...
Regular, period gross = 320.00 -> ...
Regular, YTD gross = 16,640.00 -> ...
Overtime, rate = 15.00 -> ...
...

Deductions (table)
Federal income tax = -40.60 -> fed_inc_tax = 291.90
Social security tax = -28.05 -> ss_tax = 28.05

Net Pay (key-value)
Net pay this period = \$291.90 -> net_pay = 291.90

Name (key entity) = "JOHN STILES" -> name = "John Stiles"

St Address (key entity) = 101 MAIN STREET -> ...
...

Technology solution overview:

Intelligent Document Processing – Normalize & Transform

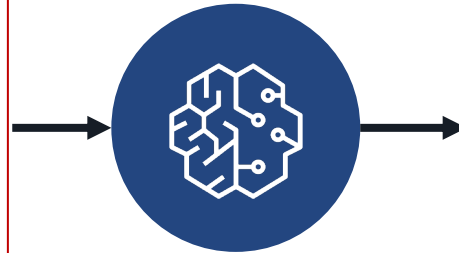
```
Pay Period (key-value)
  Period ending      = "7/18/2008"
  Pay date           = "7/25/2008"

Earnings (table)
  Regular, rate      = 10.00
  Regular, hours     = 32.00
  Regular, period gross = 320.00
  Regular, YTD gross  = 16,640.00
  Overtime, rate     = 15.00
  ...

Deductions (table)
  Federal income tax = -40.60
  Social security tax = -28.05

Net Pay (key-value)
  Net pay this period = $291.90

Name (key entity)    = "JOHN STILES"
St Address (key entity) = 101 MAIN STREET
...
```



Normalization pipeline
Custom transform pipeline

```
Pay Period (key-value)
  Period ending      = "7/18/2008"  -> pay_end = "2008-07-18"
  Pay date           = "7/25/2008"  -> pay_date = "2008-07-25"
                                          ~> pay_denom ~ 7

Earnings (table)
  Regular, rate      = 10.00          -> ...
  Regular, hours     = 32.00          -> ...
  Regular, period gross = 320.00      -> ...
  Regular, YTD gross  = 16,640.00     -> ...
  Overtime, rate     = 15.00          -> ...
  ...

Deductions (table)
  Federal income tax = -40.60          -> fed_inc_tax = 291.90
  Social security tax = -28.05         -> ss_tax = 28.05

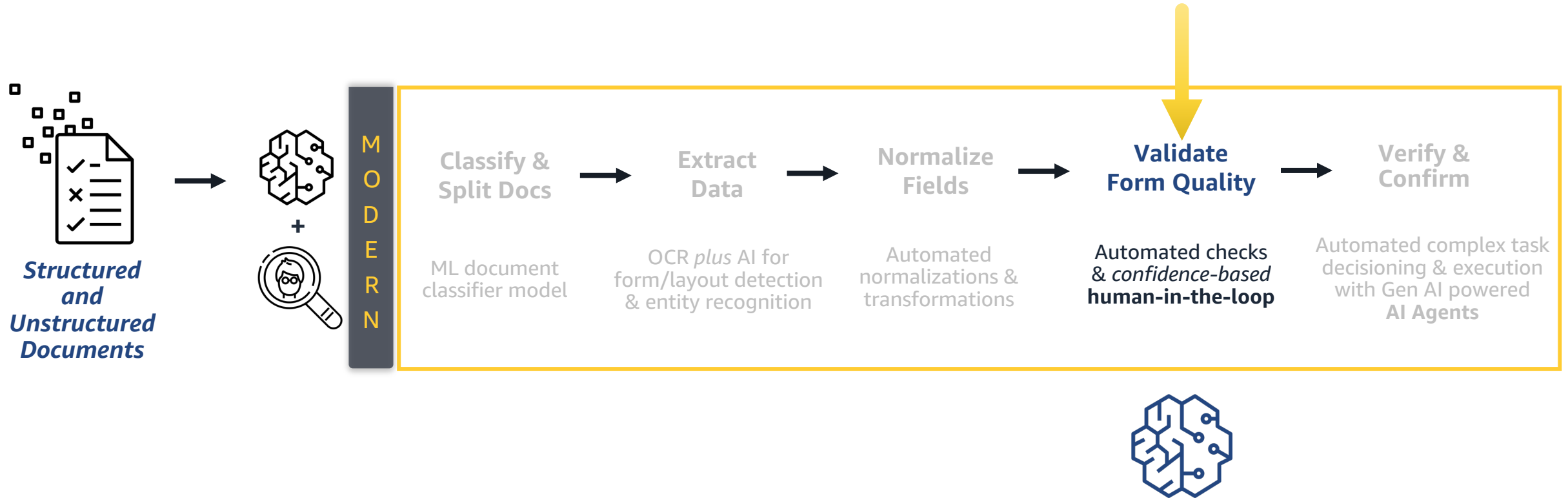
Net Pay (key-value)
  Net pay this period = $291.90        -> net_pay = 291.90

Name (key entity)    = "JOHN STILES"  -> name = "John Stiles"
                                          ~> name_last = "Stiles"
                                          ~> name_first = "John"
                                          ~> name_middle = None

St Address (key entity) = 101 MAIN STREET -> ...
...
```

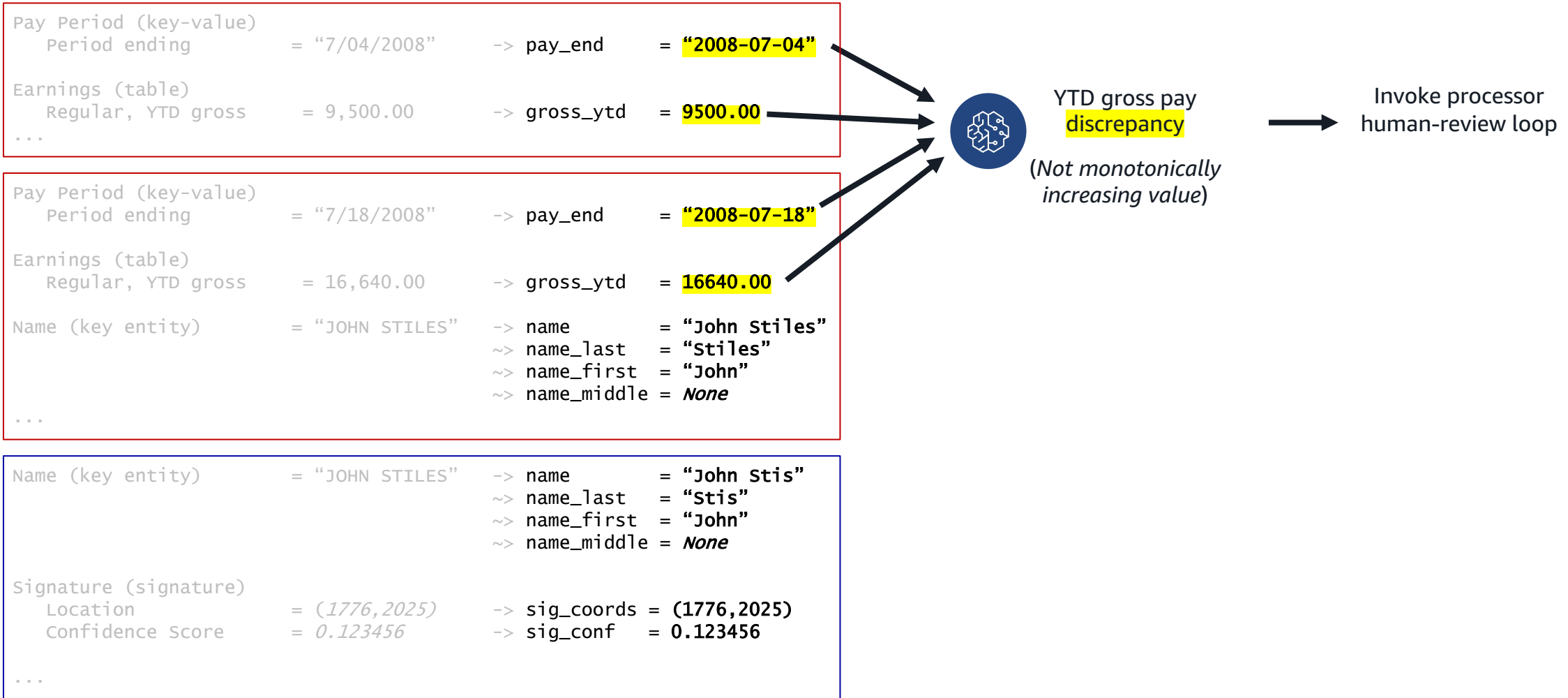
Technology solution overview:

Intelligent Document Processing – Validation



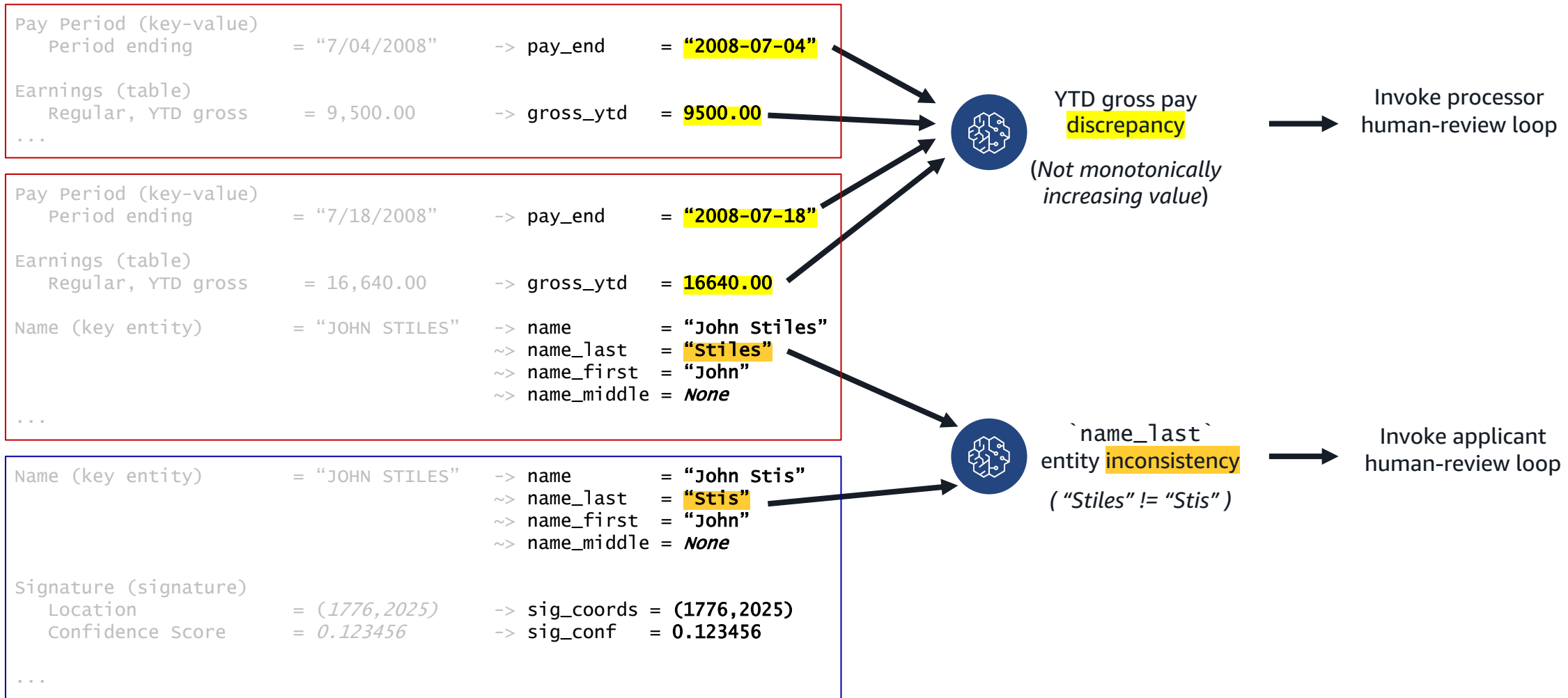
Technology solution overview:

Intelligent Document Processing – Validation



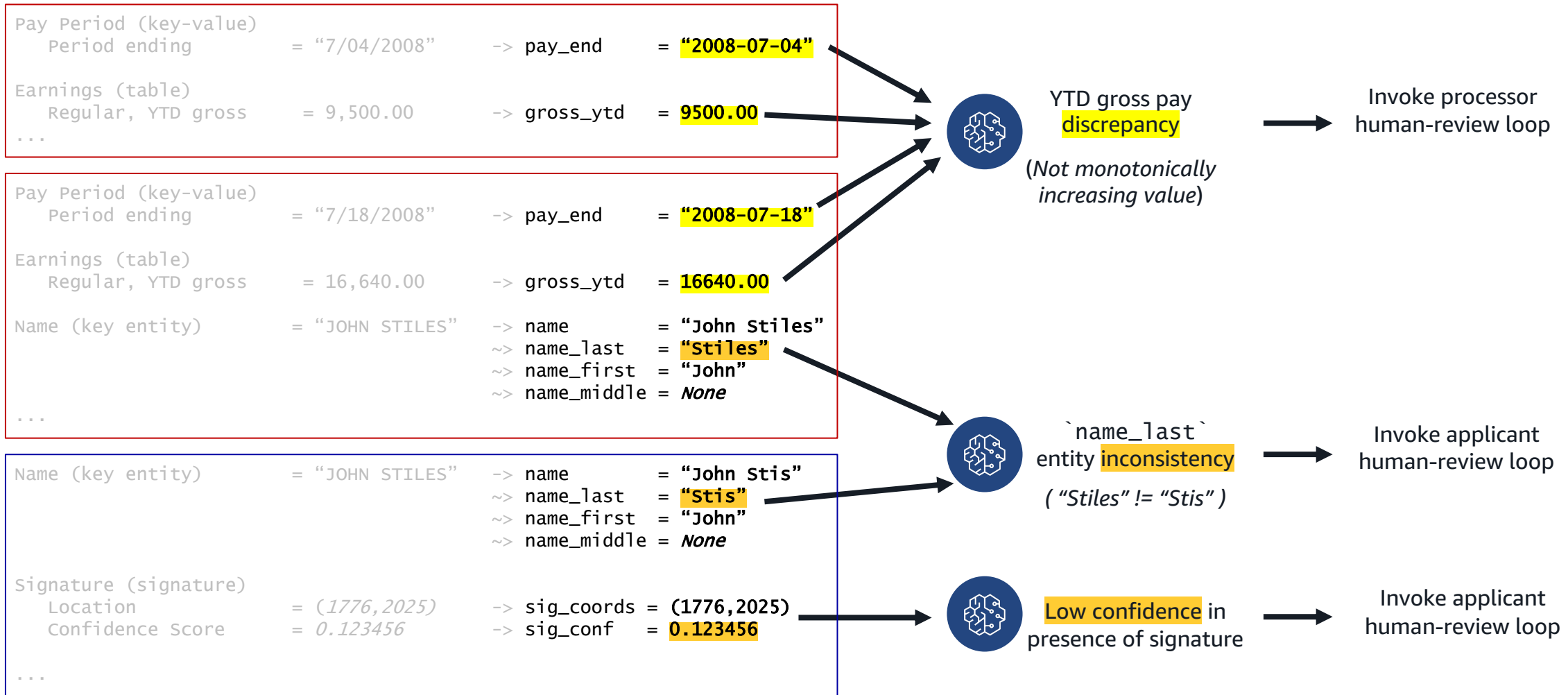
Technology solution overview:

Intelligent Document Processing – Validation

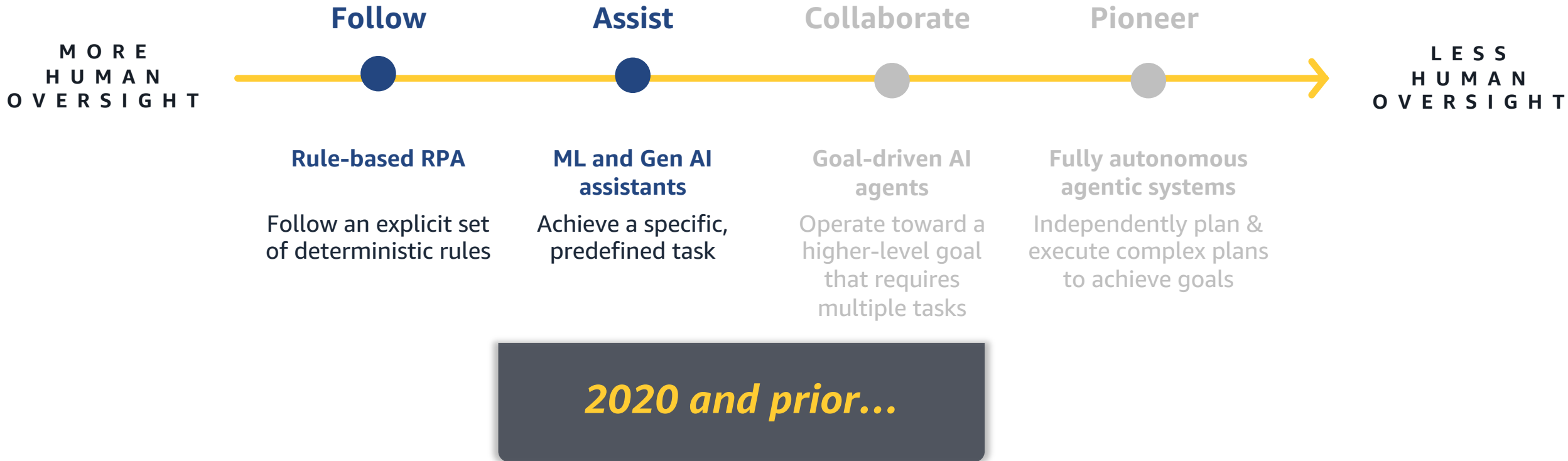


Technology solution overview:

Intelligent Document Processing – Validation

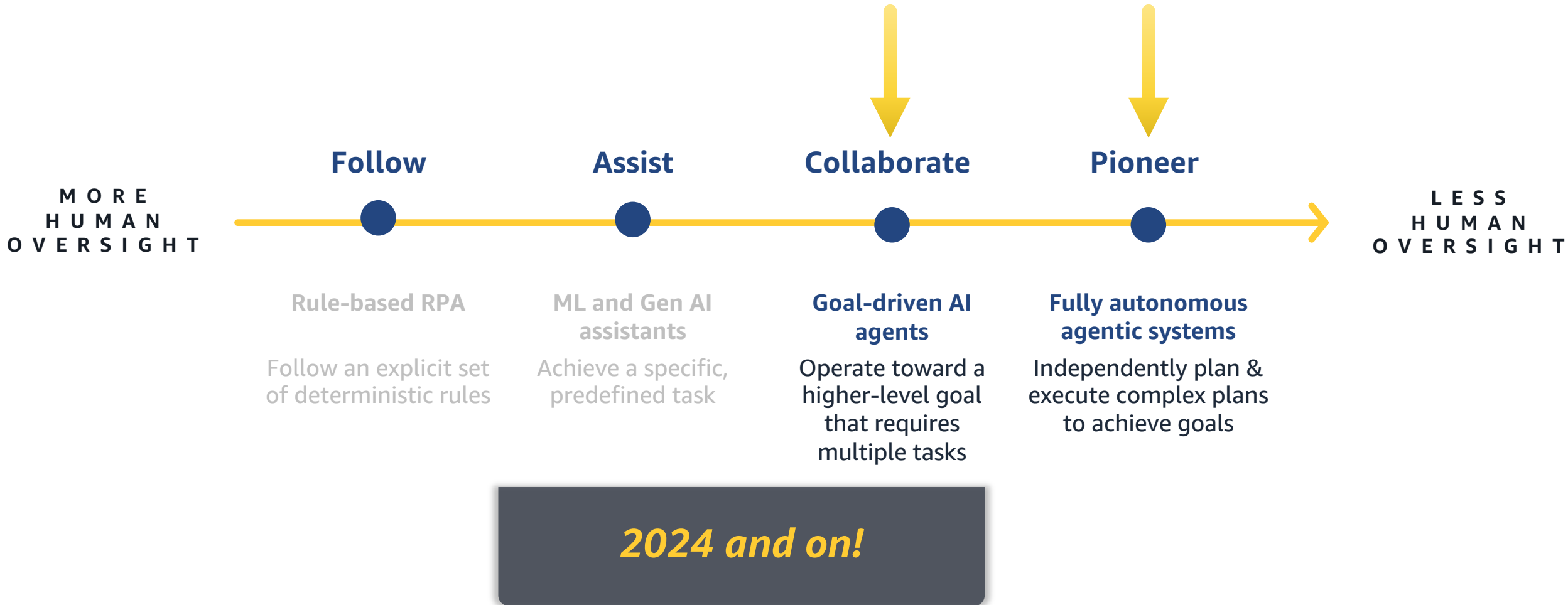


Technology solution overview: *Intelligent Document Processing...*



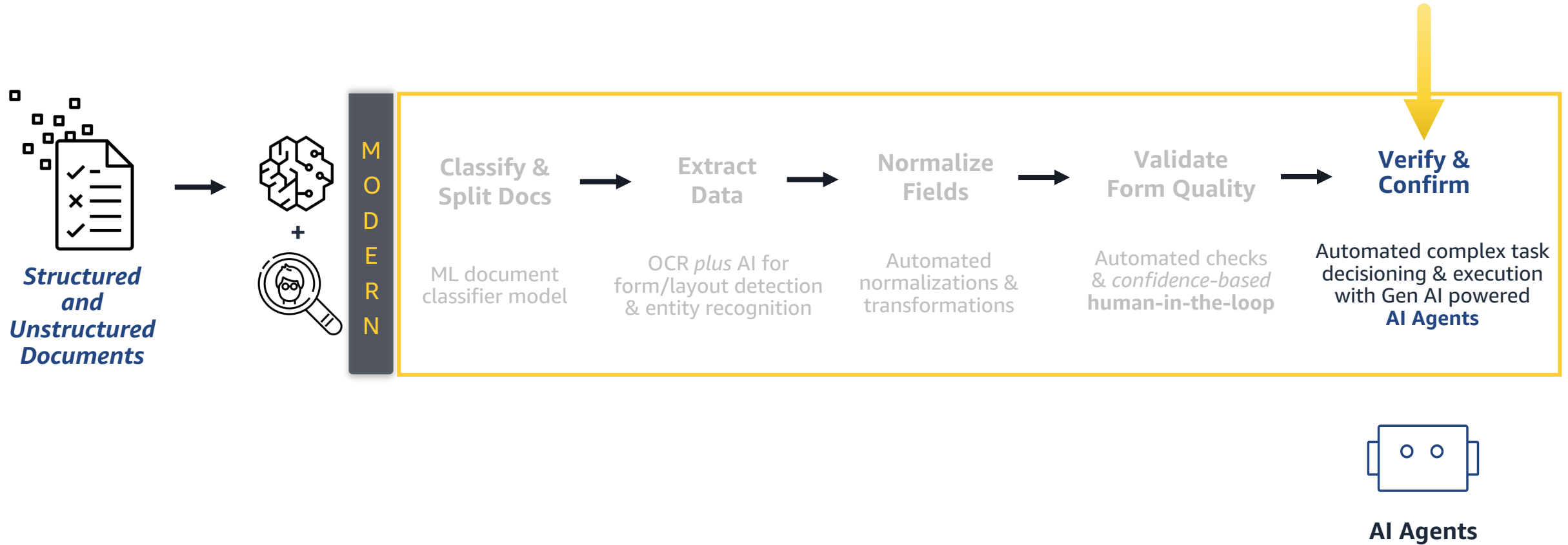
Technology solution overview:

Intelligent Document Processing... with Agentic AI



Technology solution overview:

Intelligent Document Processing – Complex analysis/action



Bringing it all together:
End-to-end IDP with AI Agents

Bringing it all together:
AI Agents concepts

LLMs are getting
smarter, faster, and more cost effective

Purpose-built models → General-purpose LLMs



Bringing it all together:
AI Agents concepts



AI agents

A T E C T O N I C S H I F T F O R H O W W E

B U I L D

D E P L O Y

I N T E R A C T



What are AI agents?



Autonomous or semi-autonomous software systems that can **reason, plan, and act** to accomplish goals in digital or physical environments.

Bringing it all together:

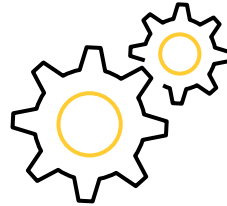
AI Agents use case evolution

Internal productivity



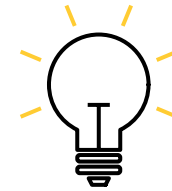
e.g. Internal research,
internal Q&A chatbots,
software development

Defined business workflows



e.g. Document processing,
compliance validation,
fraud detection

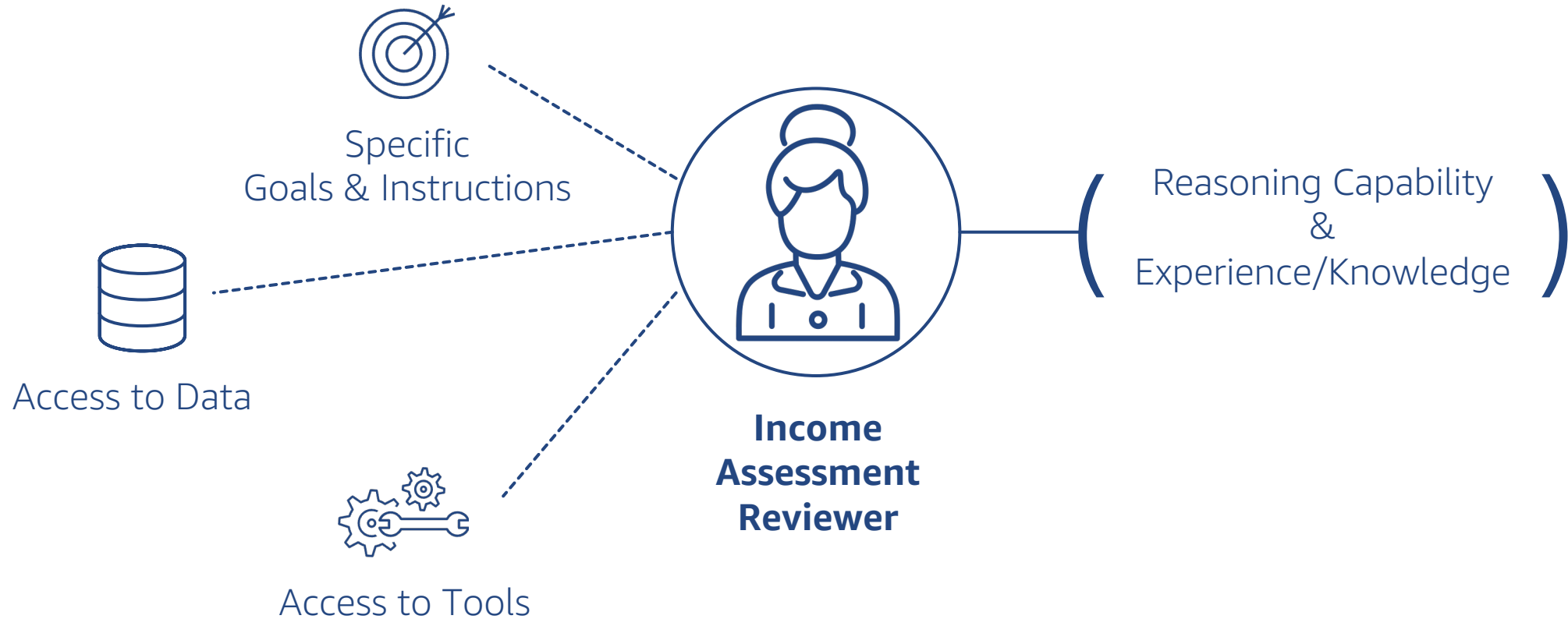
Fully-autonomous workflows



e.g. End-to-end self-
orchestrating LOS customer
assistants

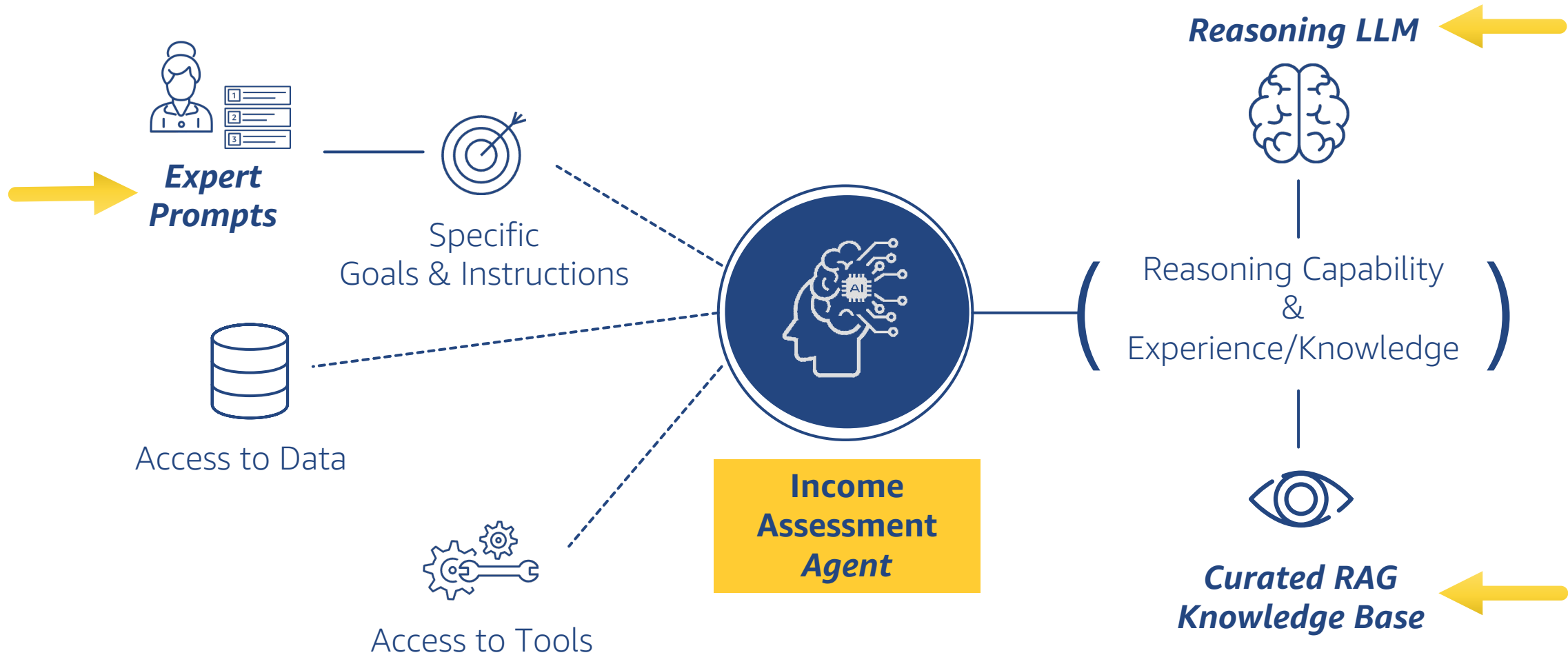
Bringing it all together:

AI Agents for complex loan process



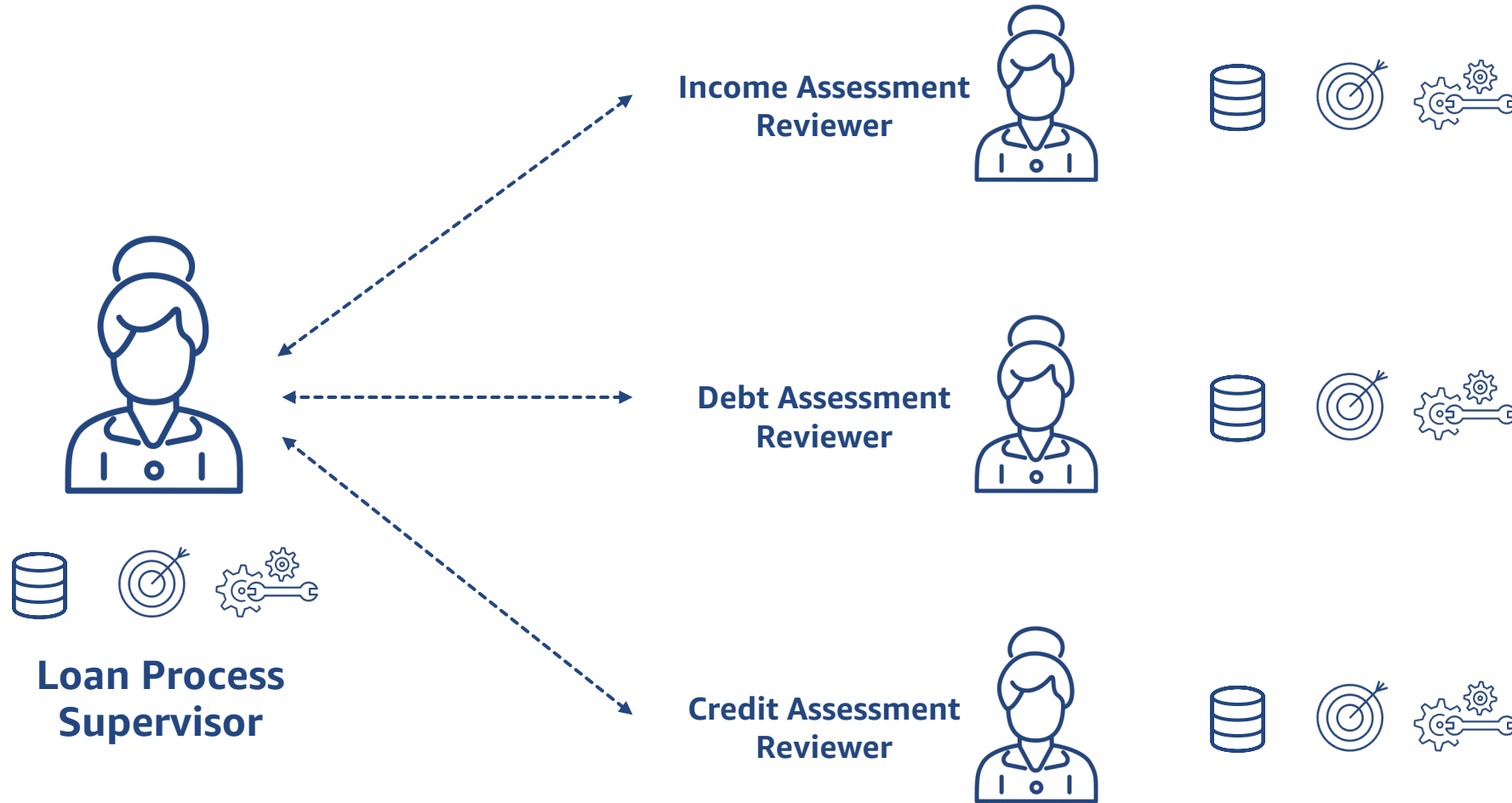
Bringing it all together:

AI Agents for complex loan process



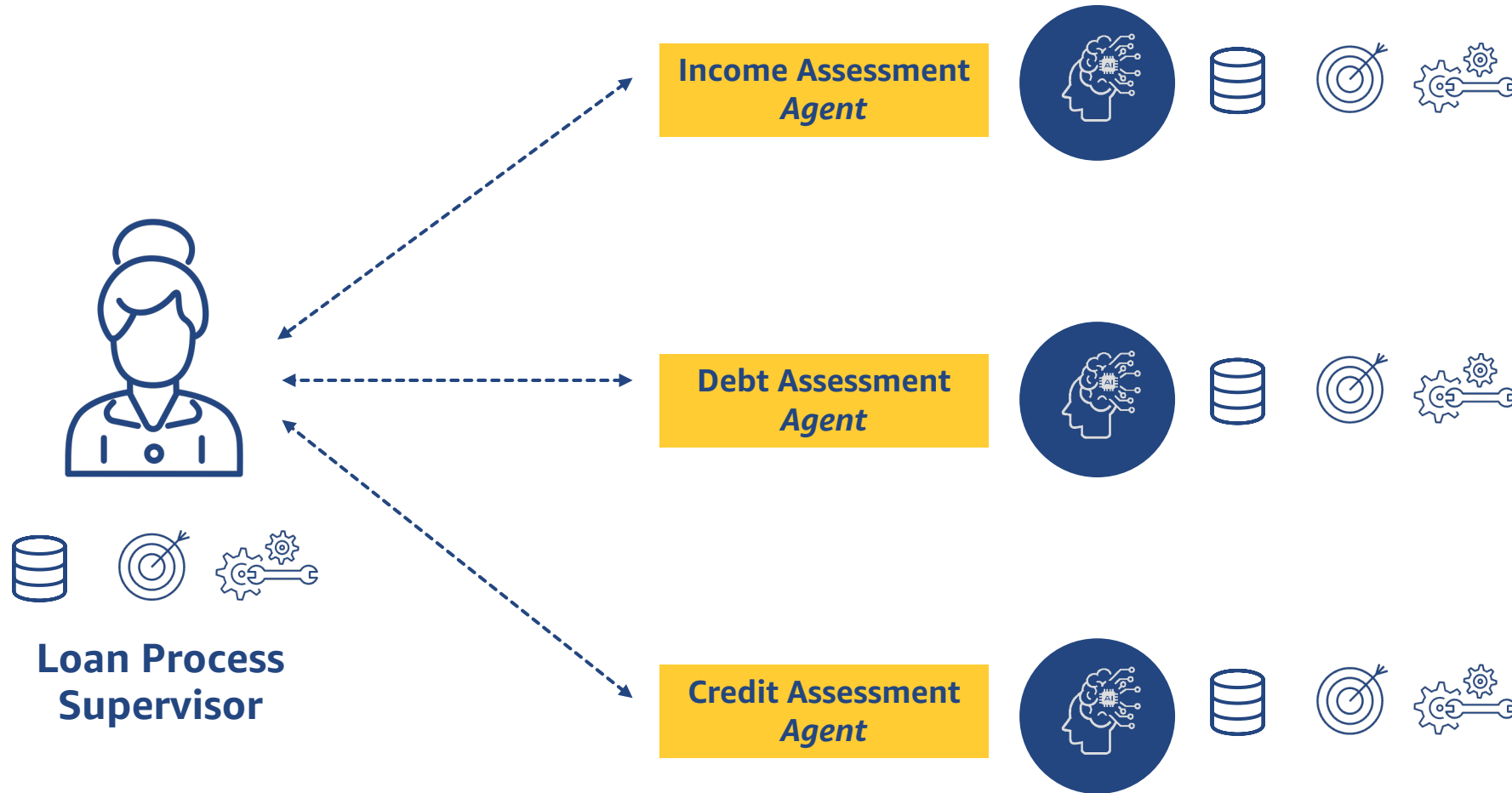
Bringing it all together:

AI Agents for complex loan process



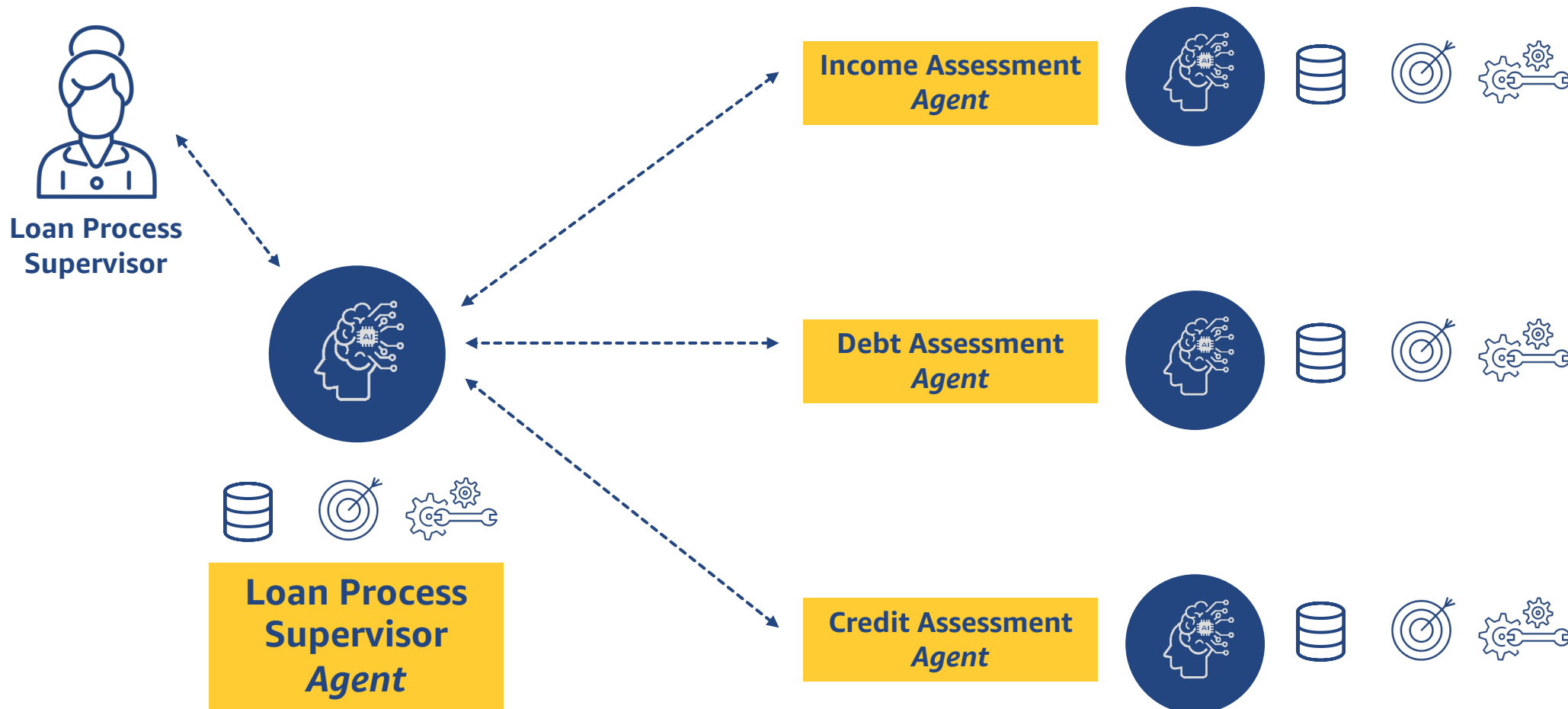
Bringing it all together:

AI Agents for complex loan process

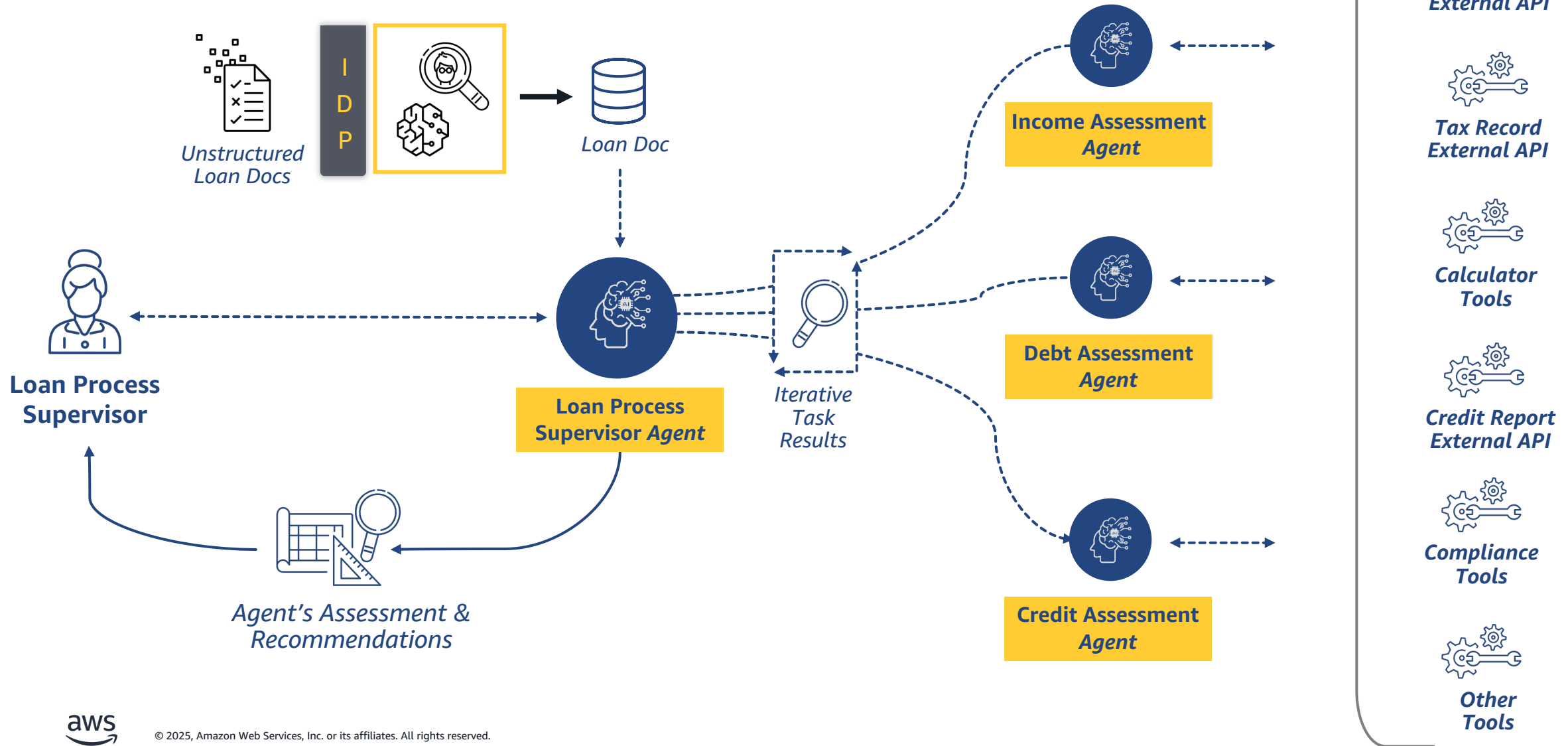


Bringing it all together:

AI Agents for complex loan process

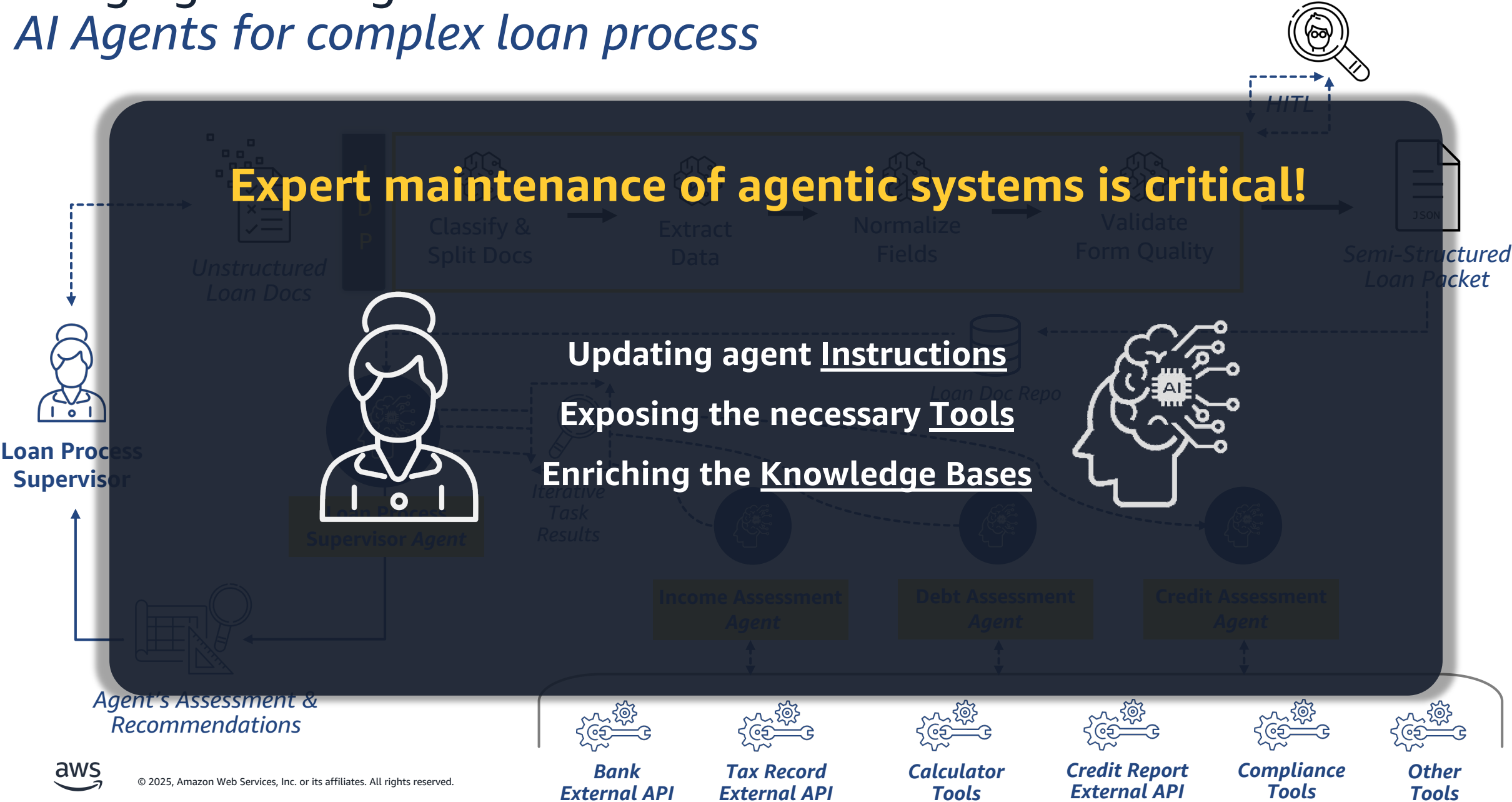


Bringing it all together: *AI Agents for complex loan process*



Bringing it all together:

AI Agents for complex loan process



Bringing it all together:
End-to-end IDP with AI Agents

DEMO



Please upload your **payslip**, **bank statement**, and **credit report**



Pro Tip

Don't worry about naming the files a certain way. Our AI agents will automatically identify and process your documents.

Applicant: John Citizen

Upload Documents (3 required)



Drop files here or click to browse

0/3 files selected · PDF, DOC, DOCX, JSON, Images

Back

Submit Application



Agentic Loan Underwriting



Choose your experience:



Case Management

View and manage all applicant documents, track their status, and access detailed processing information. Validate the data with intelligent document processing.

View Cases



AI-Assisted Assessment

Witness AI agents process the same loan: automating document analysis, cross-checking data, and providing quick assessment recommendations, all under human supervision.

Start AI-Assisted Assessment

For demo purposes, [start with the borrower view](#) to upload new documents!

aws

Agentic Loan Underwriting

AI-Assisted Assessment

Application Submitted

Agentic Review

Agentic Recommendation

Human Approval

Info Needed / Proceed to Close

Disconnected

Connect Disconnect Clear

Select an agent for details

Files Received

Supervisor

Credit Agent

Income Agent

Expense Agent

Supervisor Recommendation

Application ID:

John-Citizen

Deploying modern AI solutions: *Where to start? Buy? Build?*

Deploying modern AI solutions:

The problem space for AI... much broader than IDP!



Discover



Apply



Underwrite



Close



Service



Manage

Deploying modern AI solutions:

The problem space for AI... much broader than IDP!

According to a top U.S. retail mortgage lender servicing millions of clients, building AWS cloud-native automation solutions resulted in:

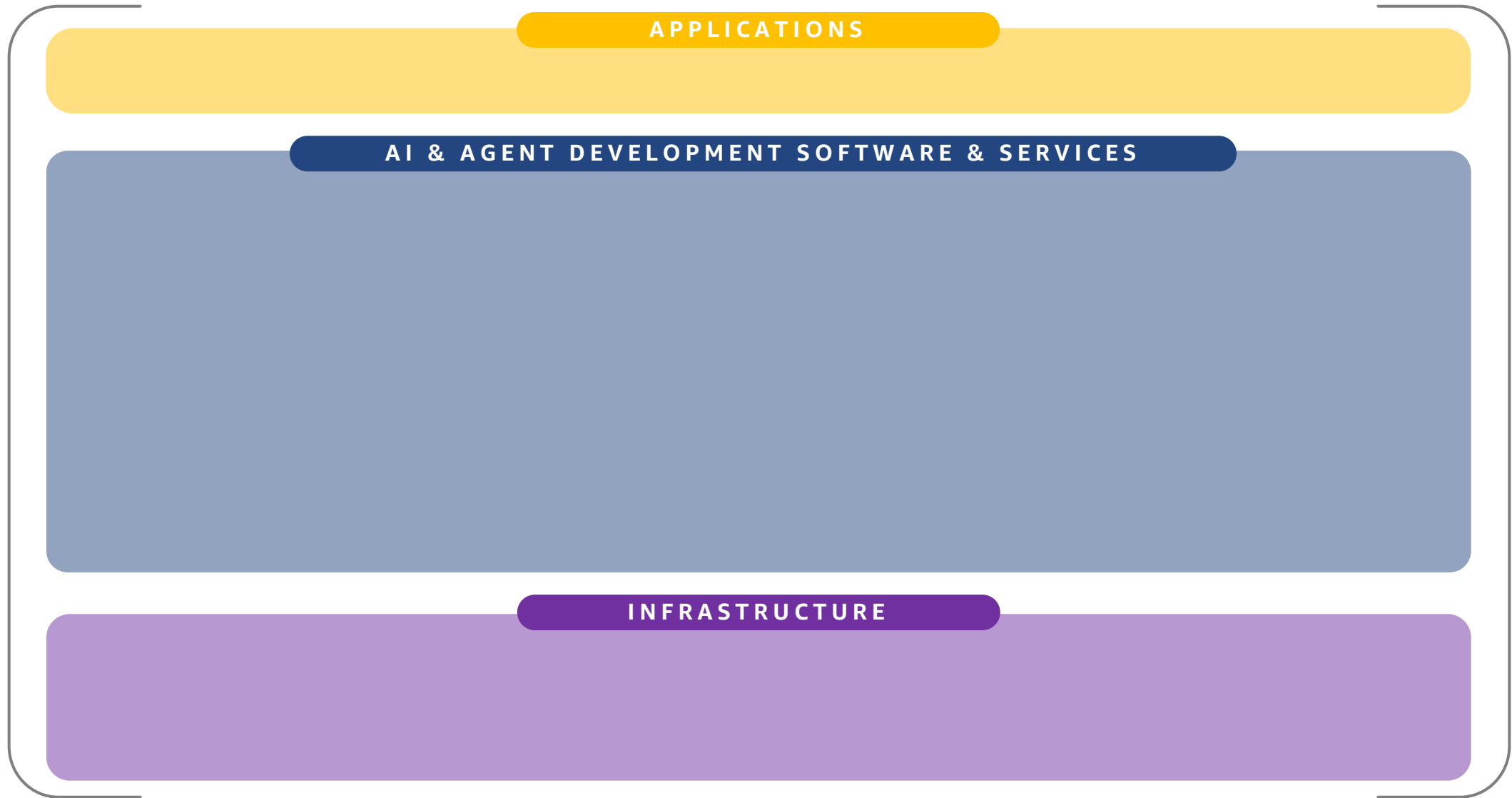
- **40,000 team hours** saved annually by post-call interaction AI
- **20,000 team hours** saved annually by +10% in first-call resolution
- **70% fully self-serve** with generative AI powered servicing client IVR

<https://aws.amazon.com/blogs/machine-learning/transforming-home-ownership-with-amazon-transcribe-call-analytics-amazon-comprehend-and-amazon-bedrock-rocket-mortgages-journey-with-aws/> (2024)



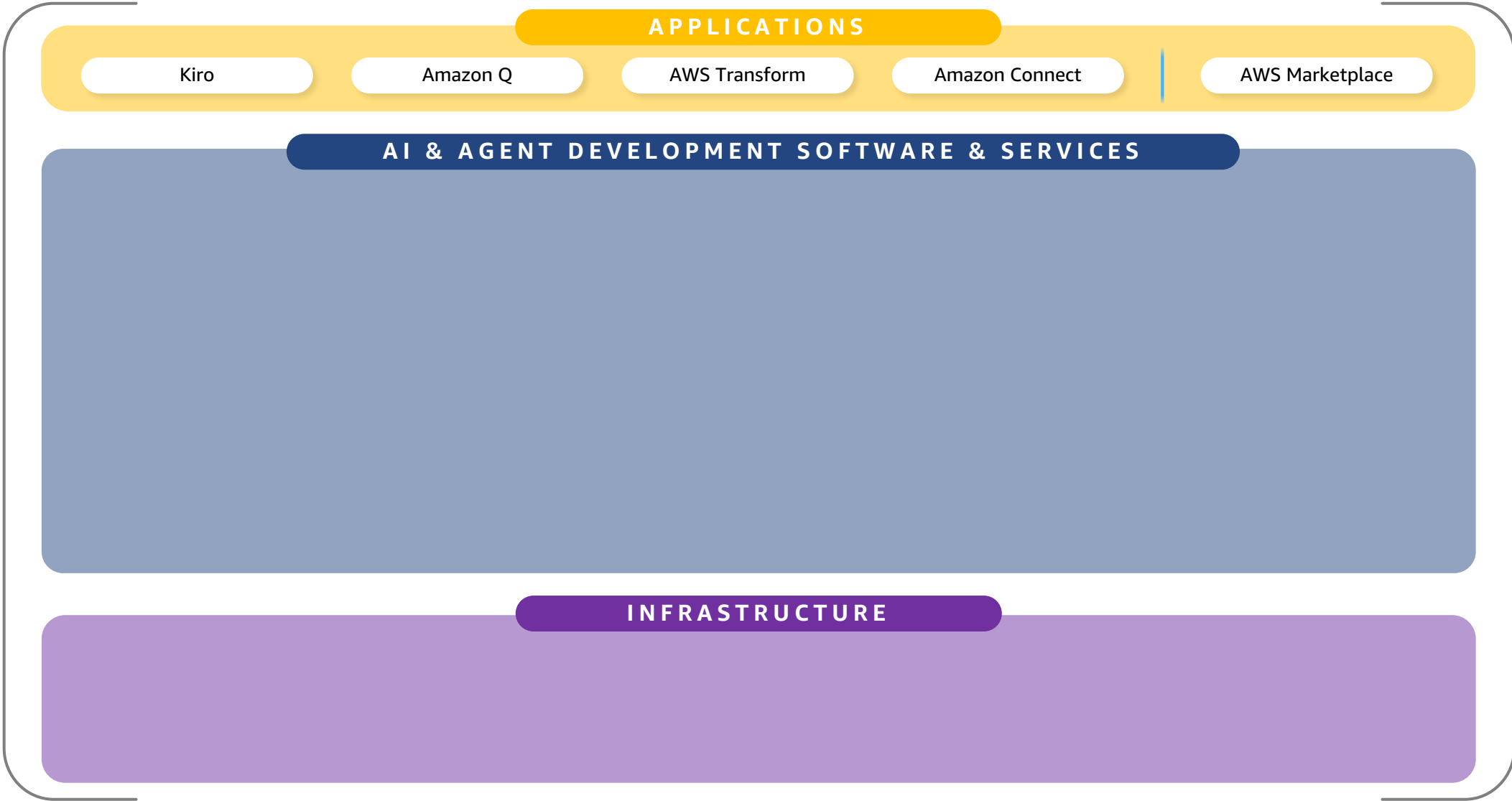
Deploying modern AI solutions:

The AWS AI services stack



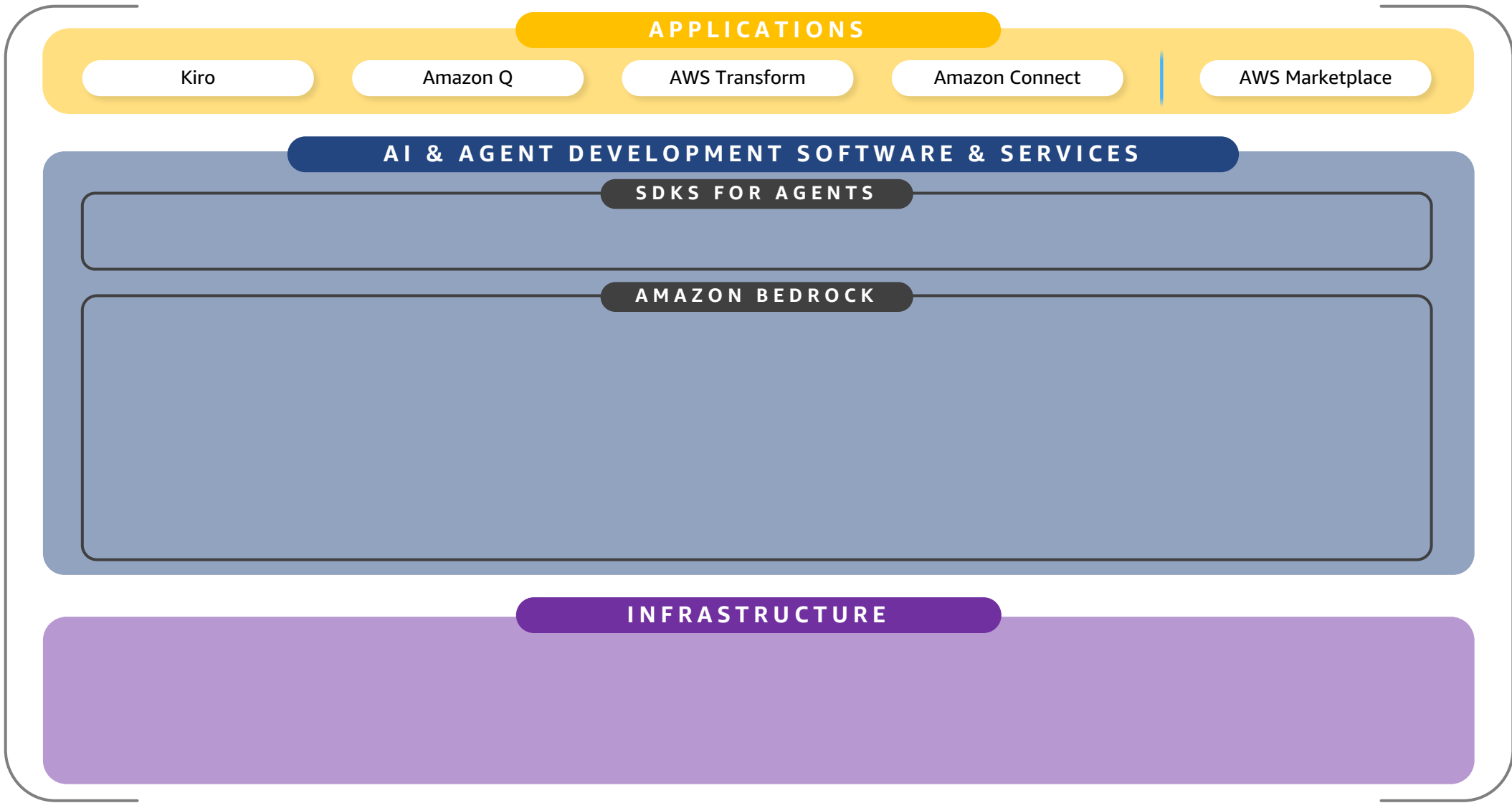
Deploying modern AI solutions:

The AWS AI services stack



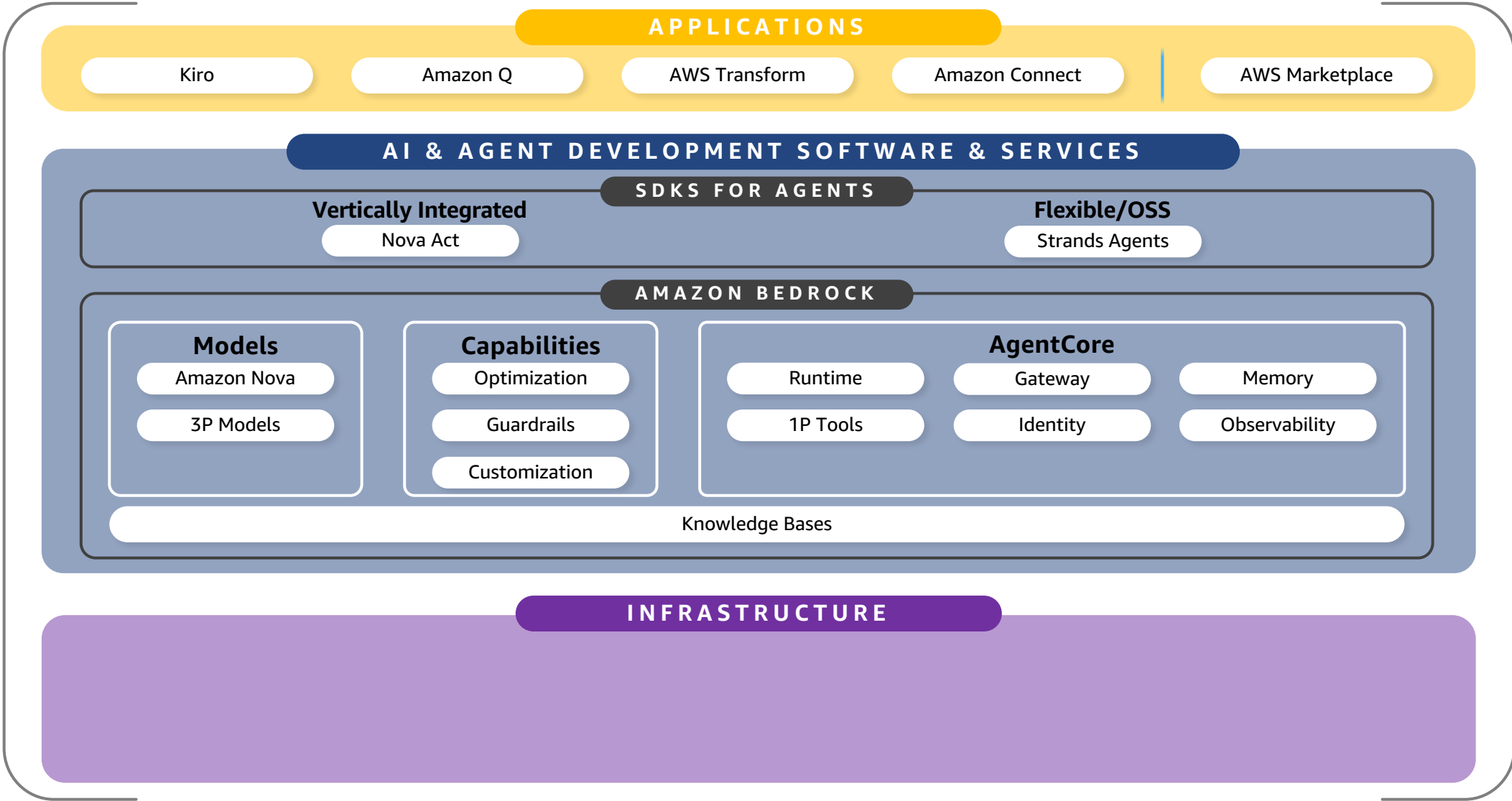
Deploying modern AI solutions:

The AWS AI services stack



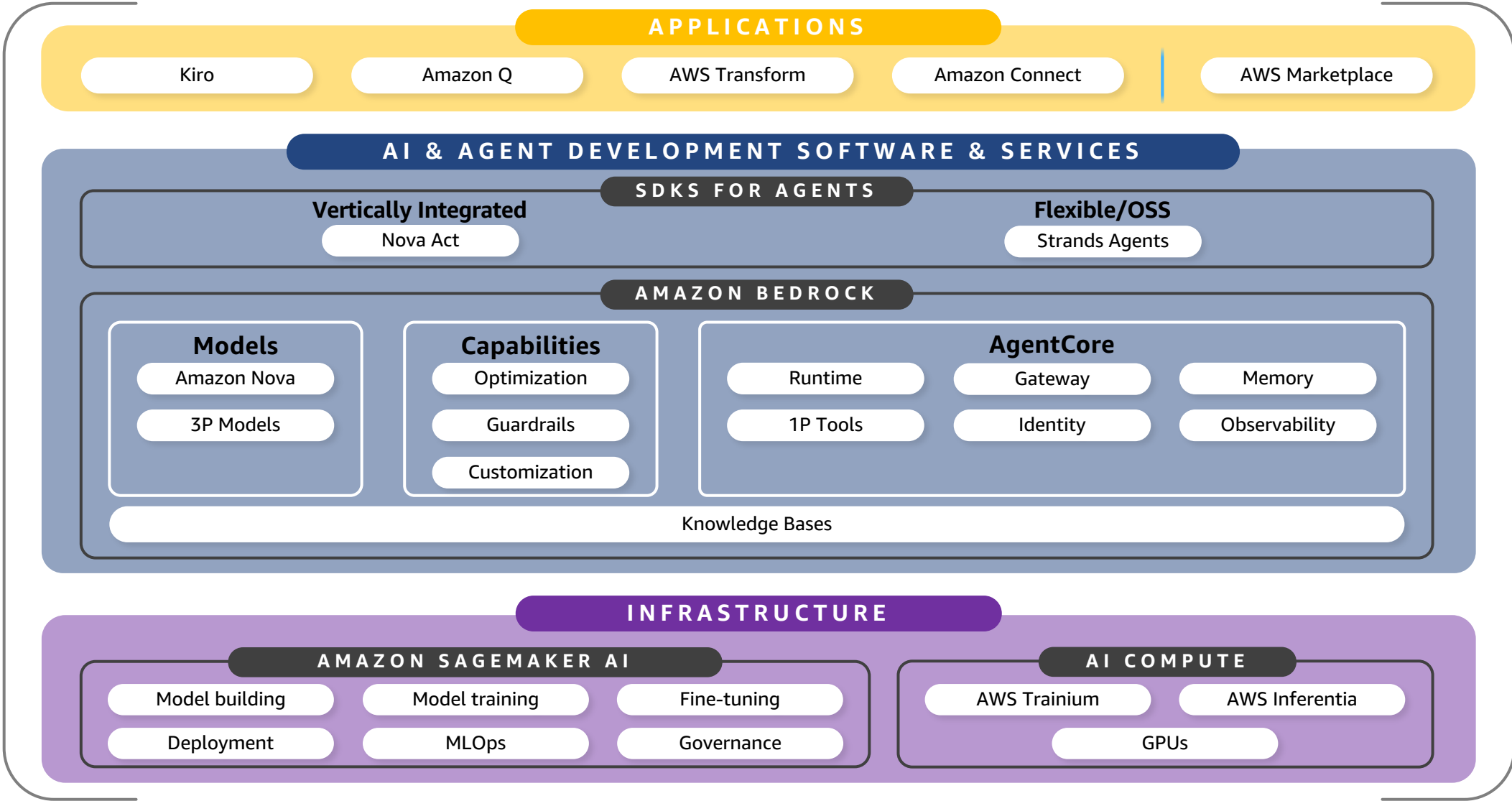
Deploying modern AI solutions:

The AWS AI services stack



Deploying modern AI solutions:

The AWS AI services stack

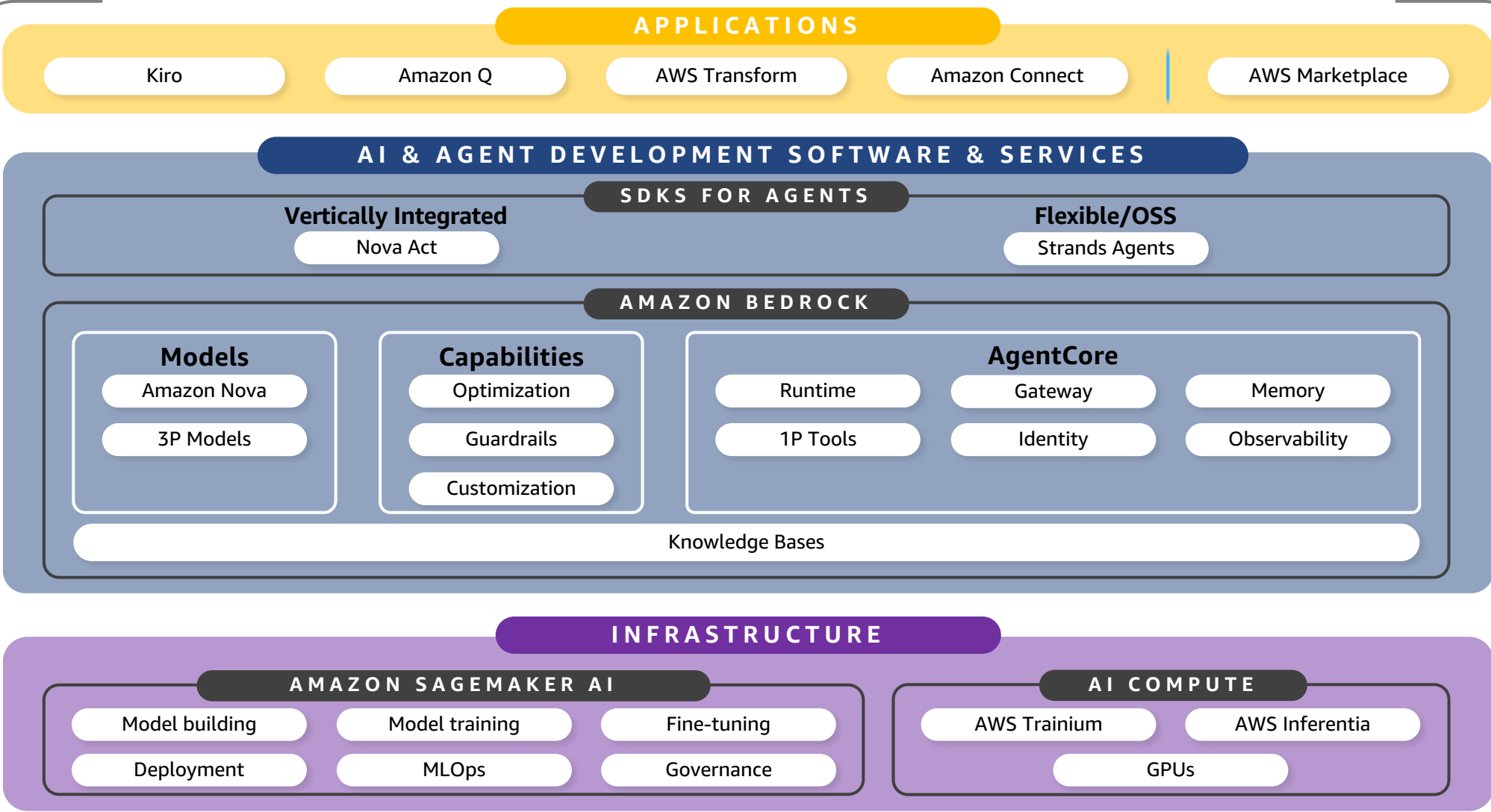


Deploying modern AI solutions:

The AWS AI services stack

INTERFACES & PROTOCOLS
(MCP/A2A)

DATA



Deploying modern AI solutions:

Why build production AI workloads on AWS?

EXPERIENCE

18 years

helping millions
of customers

GLOBAL REACH

38 Regions

120 Availability Zones
140+ Direct Connect locations

SECURITY

300+

security features

Supporting regulated FSI workloads

INNOVATION

250+

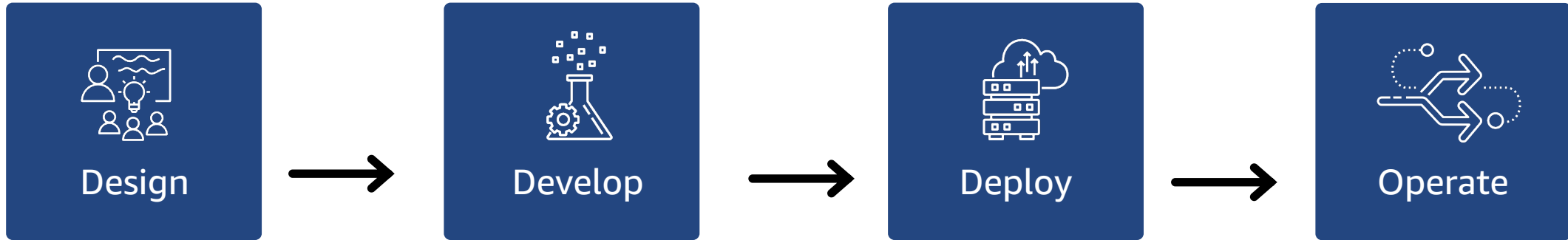
service offerings

with 30+ ML & AI services



Deploying modern AI solutions:

How can we get started?



AWS Generative AI Innovation Center

AWS Prototyping and Cloud Engineering

AWS Professional Services

Amazon Partner Network & AWS Solution Architects





AI-powered IDP on AWS

<https://aws.amazon.com/ai/generative-ai/use-cases/document-processing/>



AWS for Financial Services

<https://aws.amazon.com/financial-services/machine-learning/>



Thank you!

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yamjonat@amazon.com

