



# Combat Denials with Machine Intelligence

Erica Franko

Senior Vice President and Managing Director,  
Advisory Services  
nThrive

**HiMSS**

**CENTRAL & SOUTHERN OHIO** *Chapter*

# Agenda

- Align on Terminology
- Cost of Denials and Increasing Risks
- Managing Denials
- Rejection Prevention
- How Machine Learning and AI can help

# The REAL Industry Overview and Market Trends

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# Denials Defined

- The refusal of an insurance company or carrier to honor a request by an individual (or his or her provider) to pay for health care services obtained from a health care professional  
<https://www.healthinsurance.org/>
- Any intentional reduction of payment resulting from the failure to provide medically necessary services in an appropriate setting, failure to follow the payers' technical guidelines, or failure to consistently document for the services provided. (HFMA)

**Were you paid what was owed?**

# Vocabulary of Denials Management

## Limiting Denials

Charge Capture  
Conservative Billing Practices  
Untimely Billing  
Incomplete Accounts



## Technical

Administrative Errors  
Missing or Invalid Authorizations  
Coordination of Benefit/Eligibility Issues



## Under/Over Payment

Contractual Difference  
Pricing Errors



## Clinical

Medical Necessity  
Level of Care



# Vocabulary of Denials Management

## Final Denial

Write Off  
Lost Revenue

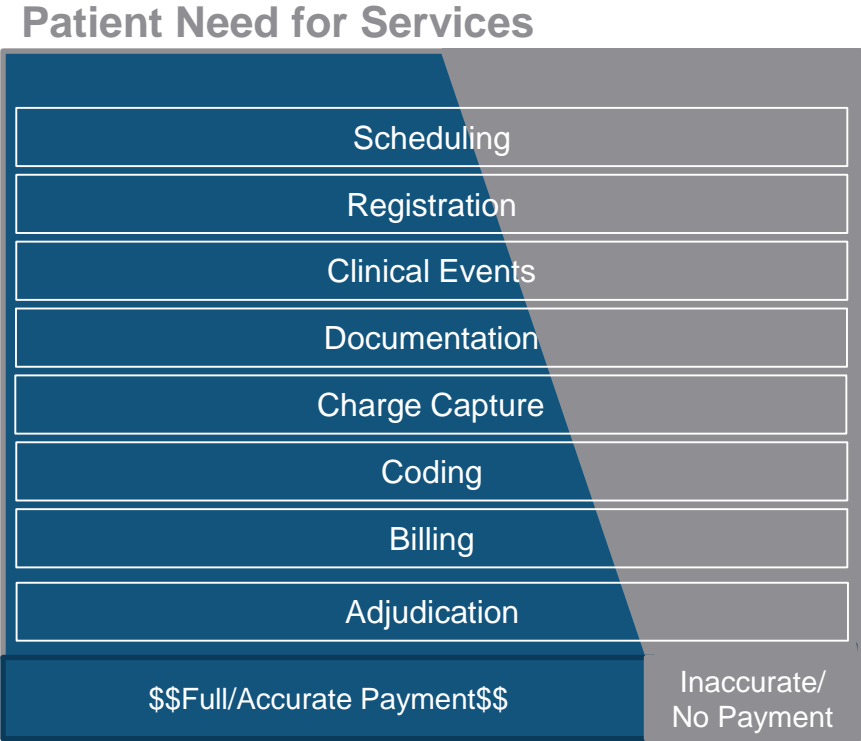
OR

## Initial Denial

Delay in Cash

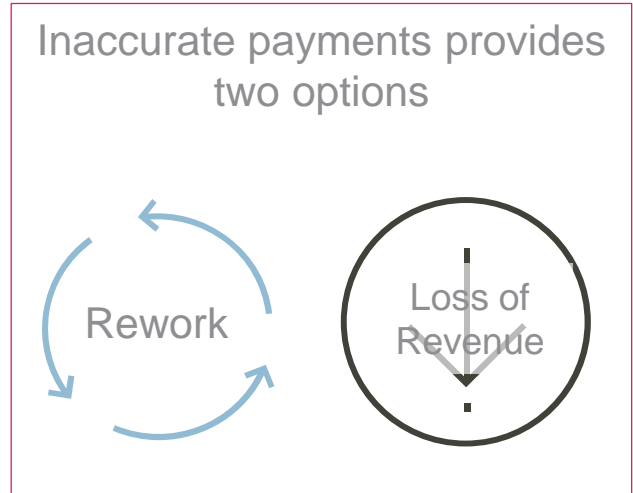
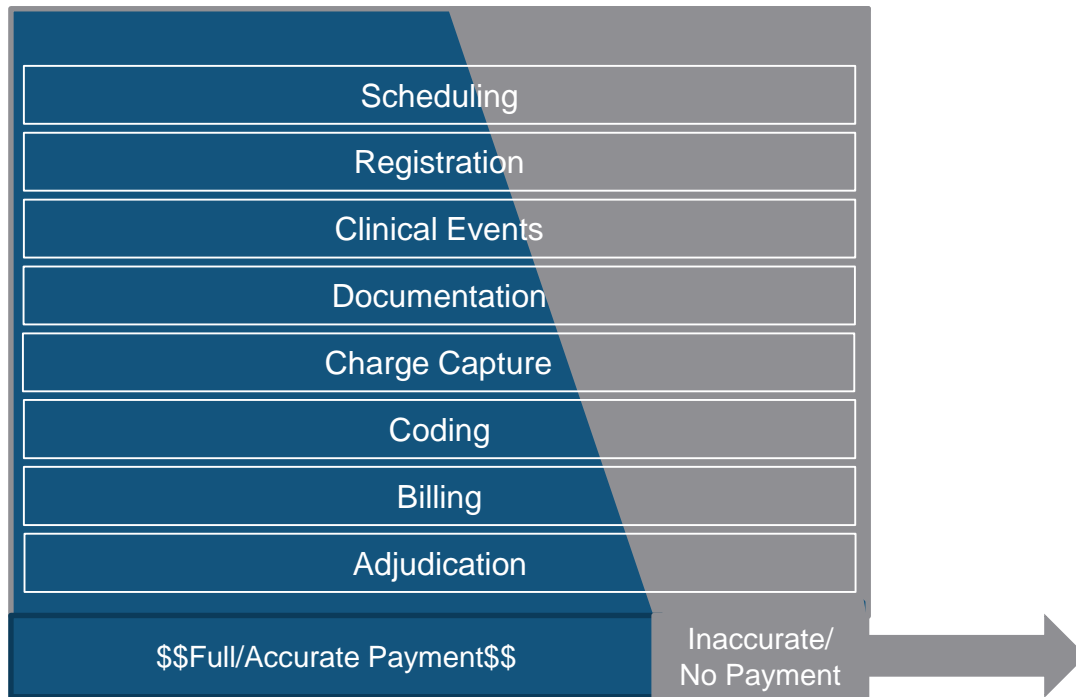
Both increase aged AR *and* typically require appeal or additional work

# Cost of Denials: Revenue Cycle Funnel



# Revenue Cycle Funnel

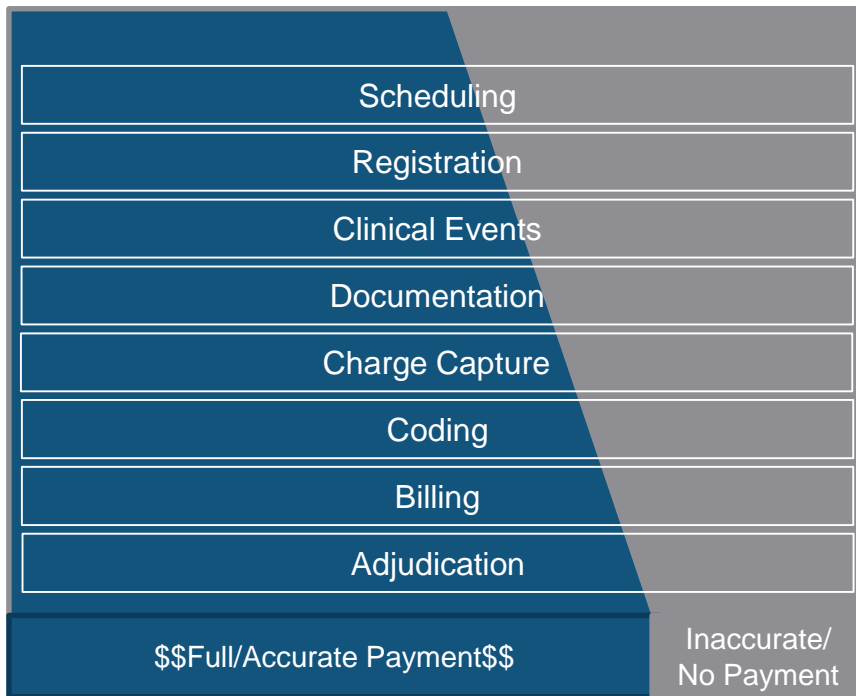
## Patient Need for Services





# Revenue Cycle Funnel

## Patient Need for Services



## Cost of Rework

- Rework costs average of \$25 per claim<sup>1</sup>
- Success rates vary from 55 to 98 percent<sup>2</sup>
- Rework adds least 14 days to the average number of days to pay<sup>3</sup>

- 1 (Leveraging Data in Healthcare: Best Practices for Controlling, Analyzing, and Using Data, by Rebecca Mendoza Saltiel Busch, CRC Press, 2016, ISBN-13: 978-1-4987-5773-7)
- 2 (Leveraging Data in Healthcare: Best Practices for Controlling, Analyzing, and Using Data, by Rebecca Mendoza Saltiel Busch, CRC Press, 2016, ISBN-13: 978-1-4987-5773-7)
- 3 (<https://revcycleintelligence.com/news/overcoming-the-top-challenges-of-claims-denial-management-audits>)



Industry average denial rate between **5-10%**



**31%**

of hospitals manage denials manually

## Impact of Denials Issue Extends Beyond Financial Results

> **\$262 billion denied,**

averaging almost **\$5 million** per hospital

The MGMA found only **35%** of providers appeal denied claim



in the next **7-12 months**



# Denials Management



"I GAVE IT A HEALTHY DOSE OF DENIAL,  
BUT IT DIDN'T HELP."

# Revenue Cycle Opportunities for Denial Management



## Scheduling

- Eligibility/Member Cannot Be Identified
- Benefit plan coverage
- Benefit maximums exceeded
- Experimental procedure
- Authorization
- Pre-existing condition
- Medical necessity
- Credentialing



## Access

- Benefit plan coverage
- Benefit maximums exceeded
- Coordination of benefits
- Eligibility
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- Pre-existing condition
- Medical necessity
- Documentation



## Patient Care

- Medical necessity
- Authorization
- Experimental procedure
- Documentation



## HIM, Charge Capture

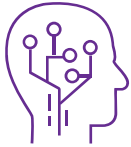
- Documentation
- Medical necessity
- Experimental procedure
- Authorization
- Benefit plan coverage
- Coding (Missing or Wrong Modifiers)



## Billing / Collection

- Bundling
- Coding
- Demographic mismatch
- Documentation
- Eligibility
- Authorization
- Pre-existing conditions
- Timely filing
- Coordination of benefits
- Duplicate Denials

# Denials are Difficult to Manage



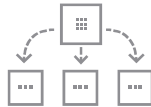
Resource and expertise intensive



Perceived inability to capture the denial data



Challenging appeals process



Denial information provided by payers not standardized



Constantly changing information



Requires coordination throughout the organization

# Measure in Pairs and Overtime

## HFMA MAP Keys

- Initial Denial Rate: Zero Pay
- Initial Denial Rate: Partial Pay
- Denials overturned by appeal
- Denial Write-offs as a percent of net revenue

## Report and Trend

- Total
- By Payer
- By Service Line
- By Reason
- By Diagnosis or DRG  
(Clinical)

## Clean Claim Rate & Denials

## AR Aging & Denial Write-offs



# What is the Initial Denial Rate?

Write-off review alone does not answer the important operational questions?

Measure denials in **volumes** and **dollars**

PAYER	TOTAL VOLUME		DENIAL RATE(PRE-APPEAL)				
	DAYS	AMOUNT	DAYS	AMOUNT	RATE(DAYS)	RATE(\$)	
<i>Payor names</i>	9,088	\$ 16,805,114	161	\$ 567,619	1.77%	3.38%	
	2,024	\$ 4,567,881	303	\$ 467,518	14.97%	10.23%	
	1,483	\$ 2,489,455	232	\$ 313,364	15.64%	12.59%	
	4,551	\$ 10,277,406	55	\$ 289,075	1.21%	2.81%	
	274	\$ 550,411	37	\$ 71,224	13.50%	12.94%	
	2,153	\$ 3,939,606	19	\$ 71,044	0.88%	1.80%	
	2715	\$ 5,989,935	8	\$ 57,701	0.29%	0.96%	
	18	\$ 57,145	3	\$ 51,334	16.67%	89.83%	
	13	\$ 45,416	5	\$ 28,248	38.46%	62.20%	
	1,940	\$ 3,687,039	16	\$ 23,968	0.82%	0.65%	
	1,544	\$ 4,776,871	4	\$ 14,052	0.26%	0.29%	
	19	\$ 19,294	2	\$ 9,480	10.53%	49.13%	
	367	\$ 1,047,392	3	\$ 8,246	0.82%	0.79%	
	560	\$ 1,791,163	2	\$ 7,922	0.36%	0.44%	
	3	\$ 5,523	3	\$ 5,523	100.00%	100.00%	
	3,173	\$ 5,768,908	4	\$ 8,012	0.13%	0.14%	
	<b>TOTAL</b>	<b>29,925</b>	<b>\$ 61,818,559</b>	<b>857</b>	<b>\$ 1,994,330</b>	<b>2.86%</b>	<b>3.23%</b>

DAYS & AMOUNT  
BASELINE : DISCHARGE DATE

PATIENT TYPE(S) INCLUDED : INPATIENT  
PAYER(S) EXCLUDED : SELF PAY, CHARITY CARE, MEDICARE, MEDICAID, OTHER - CHARITY CARE, OTHER - SELF PAY  
DISCHARGE DATES: 1/1/2016-2/29/2016

DENIAL RATE(PRE-APPEAL)			
DAYS	AMOUNT	RATE(DAYS)	RATE(\$)
161	\$ 567,619	1.77%	3.38%
303	\$ 467,518	14.97%	10.23%
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<b>857</b>	<b>\$ 1,994,330</b>	<b>2.86%</b>	<b>3.23%</b>

# What is the Rate of Appeal?

Dashboard   Payer and Insurance   Inventory Trends   Client Detail   Detail Comparison														
Client Name	Hospital Name	Ipop Status	Service Type	Primary DMS Payer	Payer Pursued	Denial Reason Type	Summary Reason	Year or Month Chart	Discharge Year					
(All)	(All)	(All)	(All)	(All)	(All)	(All)	(All)	Years	(All)					
			2013	2014	2015	2016	2017	Grand Total						
			#	#	#	#	#	#	#	#	#			
Denials Referred			34,000	\$152,728,998	40,980	\$154,432,859	51,722	\$224,324,025	45,300	\$176,721,737	559	\$1,968,794	172,561	\$710,
Denials In Review	Denials in Review	In Review Before Appeal	1	\$138	16	\$83,629	98	\$417,357	5,259	\$10,011,410	434	\$1,345,987	5,808	\$11,
Denials Closed	Denials Closed	Closed Before Appeal	20,282	\$38,052,371	23,889	\$28,515,582	22,079	\$31,611,706	20,280	\$17,773,608	56	\$3,658	86,586	\$115,
Denials Appealed	Not Resolved	Outstanding	31	\$98,948	450	\$1,470,733	4,383	\$11,383,163	8,576	\$80,278,395	68	\$615,153	13,708	\$75,
	Resolved	Upheld	9,221	\$75,542,404	11,051	\$69,975,342	15,626	\$94,532,295	7,387	\$48,579,250	1	\$3,997	43,286	\$288,
		Won	4,465	\$39,035,137	5,574	\$54,387,574	9,336	\$86,409,503	3,798	\$40,081,073			23,173	\$219,

Find the  
overturn  
sweet spot

Upheld	42,386	\$288,633,288
Won	23,173	\$219,799,726
Total	65,559	\$508,433,014
Overturn Rate	35%	43%



# How Effective are the Appeals?

Client Name		Hospital Name	Ipop Status	Service Type	Primary DMS Payer	Payer Pursued	Denial Reason Type	Summary Reason	Year or Month Chart	Discharge Year				
(All)		(All)	(All)	(All)	(All)	(All)	(All)	(All)	Years	(All)				
		2013		2014		2015		2016		2017	Grand Total			
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		Won	4,465	\$39,035,137	5,574	\$54,387,574	9,336	\$86,409,503	3,798	\$40,081,073			23,173	\$219,799,726

Are you appealing the **right** cases?

Are there cases that are **unappealable**?

What is the **lag time** from referral to submission?

			Grand Total	
Denials Referred			172,561	\$710,543,657
Denials Appealed	Not Resolved	Outstanding	13,708	\$73,814,392
	Resolved	Upheld	43,286	\$288,633,288
		Won	23,173	\$219,799,726

# What is the Cost to Recover?

Appeals are the most **expensive**  
and **lengthiest** way to collect  
what is rightfully owed

**Prevention** is a better way

# Denial Prevention

Denials are not addressable without understanding root cause

Managers and analysts need timely and actionable data

Visibility and partnership is needed across the revenue cycle and organization

A Comprehensive **denial prevention** strategy is required for long term success

# Normalize Data to Make it Meaningful

**N64 – claim information is inconsistent with pre-certified/authorized services**



## **No authorization?**

Review root cause and address scheduling and access?

## **Bundling?**

Service is not separately reimbursable, review for possible billing edit?

## **Service outside of authorization?**

Review with treatment team to identify whether additional services were performed and why?

## **Not a denial?**

Notification from payor about known reimbursement policy?

ANSI Codes are a result; they **do not** tell you **why** and **what** needs to be corrected

# Comprehensive Payor Contracting strategy

## Scorecards

- Denial trends
- Overturn rates

## Payor Websites and Notifications

- Access to updated policies and procedures

## Professional Groups

- Local chapters are a great source of information

## Work with Payor Contracting Team

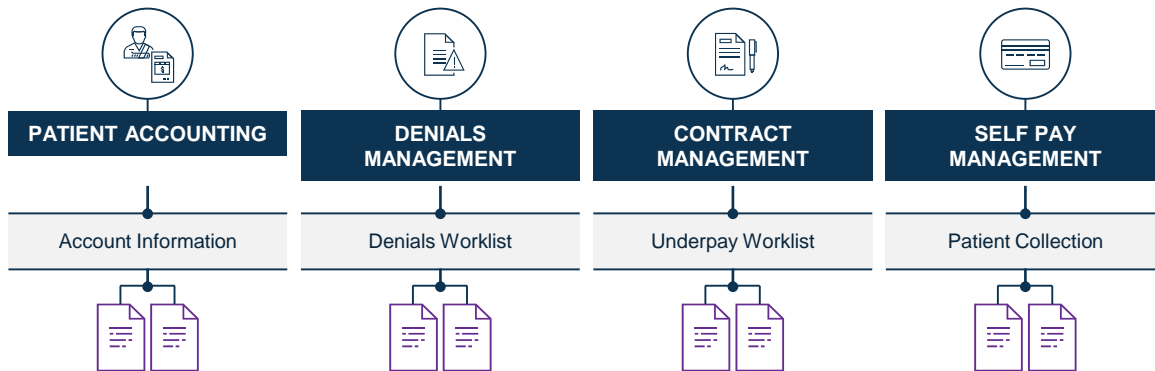
- Build protection into contracts
- Financial impact of policy changes

## Payor Relations

- Your representative needs to be part of your team

# Connect Disparate Systems and Processes and Leverage Technology

Typical Disparate Denials Technology



Multiple disjointed IT Systems

Inability to accurately identify denial root cause

Inefficiencies routing accounts to the appropriate team

# Create Governance, Ownership, and Accountability

Denials avoidance requires significant effort across the revenue cycle.

While two-thirds of denials are recoverable, **90% of denials are preventable.**

Without sustainable process improvement, technology and analytics alone will only provide a fraction of the possible results hospitals can achieve.

## Committee/Task Force

### Representation

Revenue Integrity

Managed Care/Contracting

Care Coordination (UM/UR)

Billing

Coding

Patient Access

IT

### Payor Feedback/Partnerships

### Organizational Support



# Management is Required; Denial Prevention is Key

- The goal is to move away from working denials to systemically preventing them
  - Beyond Bill Scrubbers and PAS Edits
- Recognize that eliminating 100 percent of denials is not possible
  - Continually improve and drive down top reasons
  - Small improvements can drive large financial results
  - Leverage technology to solve high volume low dollar issues
- Proactive vs. reactive
  - Denial Task Force
  - Payor Engagement
  - Root Cause



# Denials Prevention Throughout Revenue Cycle

## Machine Learning Opportunities for Denials Prevention



### Scheduling

- Benefit plan coverage
- Benefit maximums exceeded
- Eligibility
- Experimental procedure
- Authorization
- Pre-existing condition
- Medical necessity
- Credentialing



### Access

- Benefit plan coverage
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### Patient Care

- Medical necessity
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- Experimental procedure
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### HIM, Charge Capture

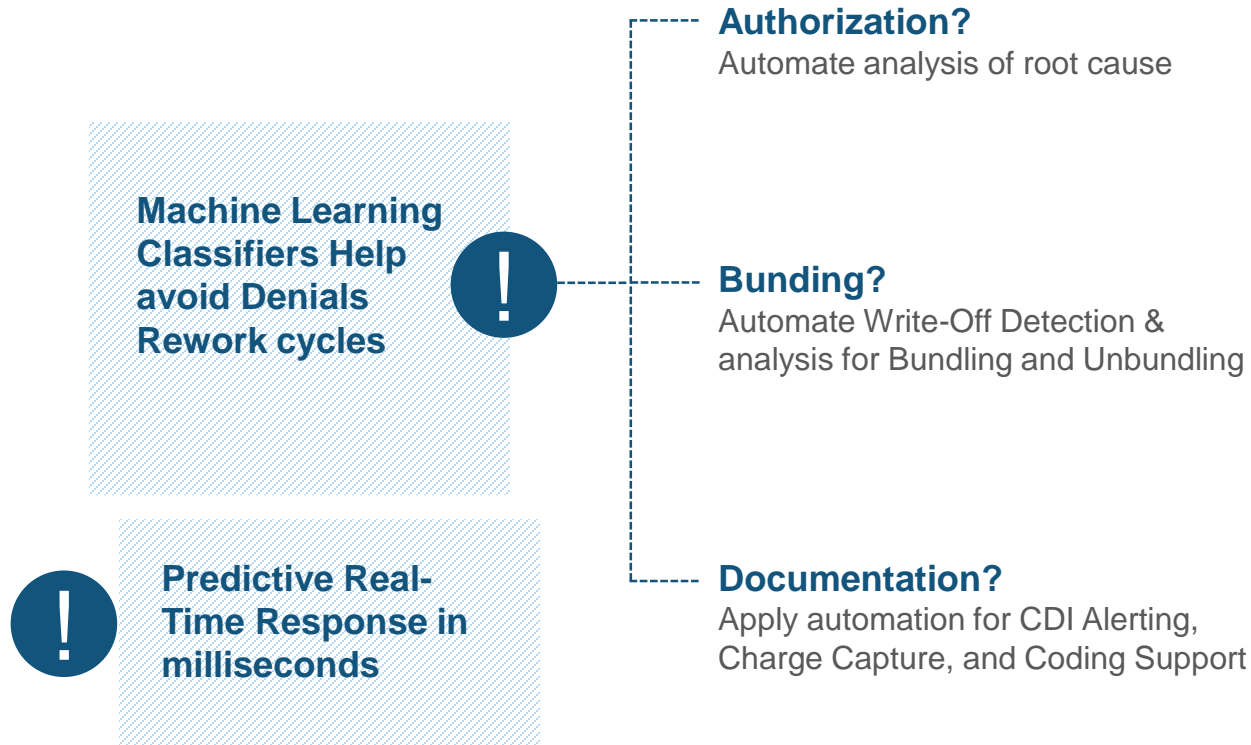
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### Billing / Collection

- Bundling
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- Demographic mismatch
- Documentation
- Eligibility
- Authorization
- Pre-existing conditions
- Timely filing
- Coordination of benefits

# Productivity & Efficiency are Challenges with Denials



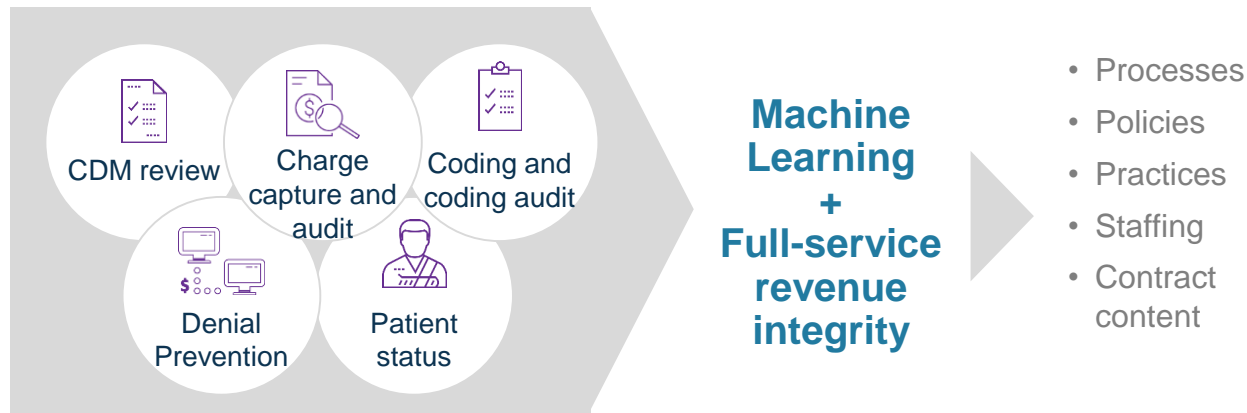
# Machine Learning Coupled to Charge Capture Audit and Denials Prevention Supports Revenue Integrity



## Revenue Integrity

Program to recognize the full value of every patient encounter

AI & Machine Learning Impact the Revenue Integrity Process with Efficiency and Accuracy Improvements







From Patient-to-Payment,<sup>SM</sup> nThrive empowers  
health care for every one in every community.<sup>®</sup>

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**Erica Franko, Senior Vice President and Managing Director, Advisory Services**

**[efranko@nthrive.com](mailto:efranko@nthrive.com)**