

Transforming Pharmaceutical Manufacturing with Process Analytical Technology: Driving the Future of Smart Production

Kanchan Gajanan Gawai¹, Rupesh Ashok Pingale², Pranjal Ajit Jadhav³, Samrudhi Deepak Bhand⁴

¹Department of Pharmaceutical Quality Assurance, NCRD's Sterling Institute of Pharmacy, Nerul, Navi Mumbai 400706, Maharashtra, India

²Principal, NCRD's Sterling Institute of Pharmacy, Nerul, Navi Mumbai, Maharashtra, India

³Department of Pharmaceutical Quality Assurance, NCRD's Sterling Institute of Pharmacy, Nerul, Navi Mumbai, Maharashtra, India

⁴Department of Pharmaceutical Quality Assurance, NCRD's Sterling Institute of Pharmacy, Nerul, Navi Mumbai, Maharashtra, India

Correspondence email¹: kanchangawai2001@gmail.com

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ABSTRACT

Process Analytical Technology (PAT) is increasingly shaping pharmaceutical manufacturing by moving quality assurance from traditional end-product testing toward real-time process understanding. Through the integration of advanced analytical tools within manufacturing operations, PAT enables continuous monitoring and control of critical material attributes and process parameters during production. This review examines the fundamental concepts of PAT and its close alignment with Quality by Design (QbD) and risk-based manufacturing approaches. Key PAT techniques—including spectroscopic, imaging, acoustic, and mass-based methods are discussed in relation to major pharmaceutical unit operations such as blending, granulation, drying, coating, and tableting. In addition, the regulatory framework supporting PAT adoption is reviewed, with particular emphasis on ICH Q8(R2), Q9(R1), Q10, Q11, Q12, and Q13 guidelines, which encourage enhanced process understanding, effective lifecycle management, and the implementation of continuous manufacturing. While PAT offers significant advantages, including improved process robustness, reduced variability, real-time release capability, and increased manufacturing efficiency, challenges related to data management, sensor integration, and model reliability remain. Overall, PAT represents a key step toward more transparent, predictable, and scientifically driven pharmaceutical manufacturing.

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1. Introduction

According to the U.S. FDA (2004), Process Analytical Technology is a system for designing, analyzing, and controlling manufacturing through timely measurements (i.e., during processing) of critical quality and performance attributes of raw and in-process materials and processes, with the goal of ensuring final product quality. Process Analytical Technology (PAT) and the Quality by Design (QbD) framework are increasingly viewed as the next major step in pharmaceutical manufacturing. These approaches help companies meet rising production demands by automating key operations and offering real-time insights for process

improvement. With the help of advanced sensors and analyzers, PAT continuously tracks and controls important process parameters, ensuring that all quality-critical attributes stay within the desired range[1].

1.1 Integration of PAT into Manufacturing Processes

Process Analytical Technology (PAT), often referred to as in situ analytics, is increasingly applied across the entire pharmaceutical development lifecycle—from early discovery through commercial manufacturing to enhance real-time process understanding and control. PAT tools are most useful in heterogeneous processes, where conventional

offline sampling may yield inconsistent or unrepresentative results because of the variability in phase composition. PAT allows direct, real-time measurement in the actual reaction environment, thus improving the reliability of measurement and minimizing the chances of process drift. As the industry has transitioned towards continuous manufacturing, the role of real-time analytical tools has become even more important. The benefits of continuous manufacturing include improved safety, accelerated development and scale-up, but these are highly dependent on robust and immediate process feedback. PAT allows for the confirmation of steady-state operation, provides support for in-process control strategies, and can also enable more advanced methods such as parametric or real-time release testing. Taken together, these considerations make in situ PAT analytics an essential part of pharmaceutical development and manufacturing in the modern, data-driven era[2].

2 PAT Framework [1]

Process Analytical Technology (PAT) has been defined as a scientific and risk-based approach that seeks to transform pharmaceutical development, manufacturing, and quality testing by integrating quality directly into the process. This is done through the use of timely, in-process measurements to understand and control the critical attributes of materials and processes in order to achieve product quality rather than testing.

2.1 Importance of Process Understanding

Process Understanding: A process is said to be well understood when key sources of variability are understood, the process is capable of handling the variability, and product quality can be predicted within a defined design space. This is achieved over time through formulation studies, small-scale experiments, scale-up, and ongoing analysis of manufacturing data.

2.2 Key Components of the PAT Framework

2.2.1 Multivariate Tools

Multivariate analysis tools include statistical experimental designs, mathematical models, simulation methods, and pattern recognition techniques. These tools can be used to recognize relationships between the various components of a formulation, process variables, and quality variables, which may not be apparent when analyzing one variable at a time.

2.2.2 Process Analyzers

Modern analyzers allow real-time assessment of physical, chemical, biological, or microbiological properties using in-line, on-line, or at-line measurements. They generate large volumes of data that can be used to monitor materials, track trends, evaluate variability, and support process control. These analyzers help define acceptable ranges and provide deeper insight into how materials behave during processing.

2.2.3 Process Control Strategies

Control strategies under PAT shift focus from fixed processing times to achieving targeted material attributes.

Real-time measurements guide feed-forward or feed-back corrections, keeping the process within a state that ensures consistent product quality. Statistical approaches including multivariate process control are important for establishing reliable acceptance criteria.

2.2.4 Continuous Improvement and Knowledge Management

Continuous learning is a central part of PAT. Data collected throughout the life cycle of a product contribute to a growing knowledge base that supports better scientific decisions, facilitates post-approval changes, and strengthens communication during regulatory interactions.

2.3 Risk-Based Approach

The framework promotes a strong connection between process understanding and risk. When the scientific understanding of a process is high, the risk of producing poor-quality product is lower, which allows for more flexible and efficient approaches to managing change and making regulatory decisions.

2.4 Integrated Systems Perspective

The framework emphasizes the importance of integrating development, production, quality assurance, and knowledge management processes. This will ensure that scientific knowledge is utilized in all stages, ranging from development to routine production, as well as in inspections and reviews.

2.5 Real-Time Release

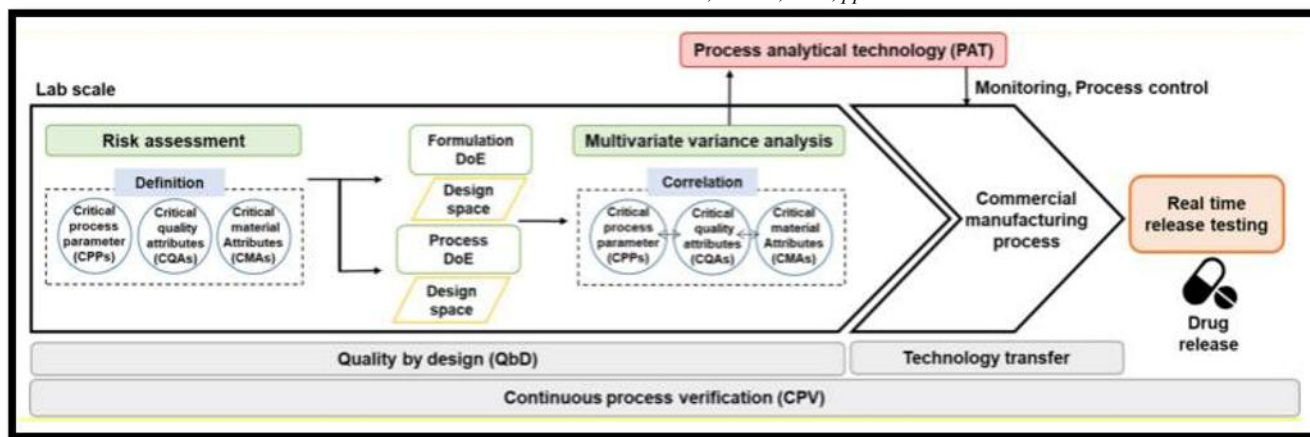
Real-time release (RTR) is the process of checking the quality of the product by monitoring the critical attributes of the material and process parameters on a continuous basis during the manufacturing process rather than testing the final product only. RTR, when properly justified, is recognized as an alternative means for ensuring the quality of the product prior to distribution.

2.6 Implementation Strategies

There are several flexible options available for the implementation of PAT, which include: implementing PAT within the existing pharmaceutical quality system, submitting regulatory supplements when appropriate, and by following a comparability protocol that describes development, validation, and implementation. Effective communication during development and implementation stages can go a long way in efficiently addressing scientific and operational issues¹.

The overall framework of Process Analytical Technology used in pharmaceutical manufacturing is illustrated in Figure 1.

Figure 1: Schematic of PAT framework for pharmaceutical unit operations (adapted from Kim et al., *Pharmaceutics*, 2021, 13, 919, under the Creative Commons Attribution (CC BY 4.0) license [3].



2.7 ICH Guidelines in Advancing Process Analytical Technology Implementation

Several guidelines issued by the International Council for Harmonisation (ICH), including Q9(R1), Q10, Q11, Q12, and

Q13, provide regulatory frameworks that supports process understanding, risk management, and lifecycle management in pharmaceutical manufacturing [4-9]. The role of these guidelines in supporting the implementation of Process Analytical Technology (PAT) is summarized in Table 1.

Table 1: Role of ICH Guidelines in Supporting Process Analytical Technology

ICH Guidelines	Title	Regulatory Emphasis	Relevance to PAT Implementation	Key References
ICH Q8 R(2)	Pharmaceutical Development	Product and Process Understanding	ICH Q8(R2) encourages a science-based approach to pharmaceutical development and a much more explicit understanding of the formulation and manufacturing process. PAT tools enable this goal by allowing real-time measurement of critical material attributes and process parameters, which is consistent with developing a well-defined design space and with enhancing process understanding.	[4]
ICH Q9 R(1)	Quality Risk Management	Risk Identification and Control	ICH Q9(R1) emphasizes structured, risk-based decision making throughout the product lifecycle. In this respect, PAT contributes by providing real-time process data that can be used for early identification of potential risks, determination of their impact on product quality, and implementation of effective control measures to reduce variability and uncertainty.	[5]
ICH Q10	Pharmaceutical Quality System	Lifecycle Quality Management	ICH Q10 emphasizes the need for a quality system that sustains product quality throughout its life cycle. PAT can help by allowing for continuous monitoring of processes, facilitating knowledge management, as well as informed decision-making to make improvements to processes by leveraging data obtained from PAT applications.	[6]
ICH Q11	Development and Manufacture of Drug Substances	Control of API Manufacturing Processes	ICH Q11 emphasizes the significance of understanding and controlling critical process parameters during the manufacture of drug substance. Process Analytical Technology helps to monitor critical steps of the process in real-time; thus, it helps in ensuring API consistency and improving robustness during development.	[7]
ICH Q12	Lifecycle Management	Post- approval change management	The expanded use of ICH Q12 adds regulatory flexibility based on its greater understanding of the process and effective controls. The scientific knowledge base established through PAT, along with real-time monitoring information, gives a solid	[8]

			scientific foundation for handling postapproval changes in a manner that is not detrimental to quality.	
ICH Q13	Continuous Manufacturing of Drug Substances and Drug Products	Modern Manufacturing Approaches	ICH Q13 establishes regulatory principles for continuous manufacturing of drug substances and drug products. PAT is a critical enabler within this framework, as continuous processes rely on real-time monitoring and control to ensure consistent quality throughout uninterrupted production.	[9]

3. PAT Tools And Techniques

The various analytical tools and techniques applied in Process Analytical Technology(PAT) for pharmaceutical manufacturing are summarized in Table 2.

Table 2: Different PAT Tools and Techniques used in Pharmaceutical Manufacturing

Different PAT Tools and Techniques Examples:	
Raman Spectroscopy	Near-Infrared Spectroscopy
Hyperspectral Imaging	Terahertz Time Domain Spectroscopy
Mass Spectrometry	Acoustic Resonance Spectroscopy
Fourier Transform Infrared Spectroscopy	Optical Coherence Tomography

3.1 Raman Spectroscopy

Raman spectroscopy is an efficient Process Analytical Technology (PAT) that can be used to analyze the blending of pharmaceutical powder in real time. With the use of a fiber-optic probe and SIMCA modeling, it is possible to analyze the uniformity of the blend and the endpoint directly in the process. Raman spectroscopy can also be used to understand the impact of important variables such as blender speed, loading, and API concentration on the blending process. Additionally, when combined with an independent analytical technique such as NIR spectroscopy, the results obtained from Raman spectroscopy can be verified, thereby enhancing process control[10].

Under the umbrella of real-time release testing (RTRT), Raman spectroscopy has been shown to be a vital PAT tool, providing key process information and facilitating efficient process monitoring and control in pharmaceutical processes such as blending, granulation, tableting, and coating. Recent developments in transmission Raman spectroscopy enable rapid, non-destructive analysis of bulk tablets and capsules, mainly for off-line content uniformity analysis. On the other hand, in-line Raman spectroscopy has been demonstrated to be useful for process monitoring of API reactions and secondary pharmaceutical processes, allowing real-time process adjustments for consistent quality[11].

3.2 Near-Infrared Spectroscopy

Near-Infrared Spectroscopy (NIR) has been identified as an efficient Process Analytical Technology (PAT) in

pharmaceutical processing due to its ability to analyze processes quickly, non-destructively, and in real-time. Unlike traditional offline analysis, NIR enables the analysis of critical quality attributes (CQAs) in real-time, thus eliminating the need for sampling and facilitating real-time release. Its applicability has been shown in various unit operations. For instance, NIR has been successfully applied for the analysis of API in tablets to ensure uniformity and specifications without interrupting the process. In continuous manufacturing systems, the use of NIR probes located in the feed frame and on newly pressed tablets enabled the real-time evaluation of blend homogeneity and tablet strength with a prediction accuracy rate of over 98%. More advanced approaches, including time-stretch NIR transmission spectroscopy, have made it possible to perform measurements in milliseconds, enabling the evaluation of every single tablet for API content. In addition, the use of NIR and multivariate calibration methods, such as PLS regression, enables the measurement of both chemical and physical properties, such as moisture content, particle size, and solid-state transformations. Taken together, these studies make it clear that with proper calibration and integration, NIR can be used for robust in-line process analysis, which can help manufacturers improve process control and product quality[12-14].

3.3 Hyperspectral Imaging

Hyperspectral imaging (HSI) is a highly advanced analytical method that integrates high chemical detail with imaging, making it significantly more capable than conventional spectroscopy or color vision systems. Unlike conventional systems that concentrate on a single point or color information, HSI involves the acquisition of a complete spectrum for every pixel in a wide area, enabling a far more detailed and comprehensive analysis. This makes it extremely useful in various industrial applications where real-time analysis and control are required, including pharmaceutical production, food processing, and chemical production. Sophisticated data analysis using chemometrics enables the processing of HSI data to produce valuable information, such as highly detailed maps of chemical composition, material identification, or the monitoring of product quality and consistency during the manufacturing process. HSI analysis is capable of producing results that represent the entire image, specific objects, or even a single pixel, depending on the requirement. This versatility helps industries ensure product quality, detect defects early, and better understand complex processes like mixing and chemical transformations. Overall, hyperspectral imaging is

becoming a crucial tool in modern process analytical technology (PAT), providing rich, detailed insights that were previously hard or impossible to achieve with conventional methods[15].

3.4 Mass Spectrometry

Mass spectrometry is a highly advanced and widely used analytical technique that plays a key role in process monitoring. It works by transforming chemical substances into gas-phase ions, which are then separated according to their mass-to-charge (m/z) ratio and detected. The results are typically presented as a mass spectrum, showing the detector response for each m/z value—similar to how optical spectrometry displays light intensity across different wavelengths. This data can also be summarized as a histogram representing the abundance of each ion in the sample, making mass spectrometry a valuable tool for real-time analysis and quality control in Process Analytical Technology (PAT)[16].

3.5 Acoustic Resonance Spectroscopy

Acoustic Resonance Spectroscopy (ARS) is a PAT technique that detects and analyzes sounds generated during pharmaceutical processes. These sounds occur at frequencies well beyond the range of human hearing. ARS is commonly applied to processes that produce acoustic emissions, including monitoring chemical reactions, blending, pulverization, and fluidized-bed granulation of drugs, offering real-time insights into process performance and product quality[17,18].

3.6 Fourier Transform Infrared Spectroscopy

Fourier Transform Infrared (FTIR) spectroscopy is capable of obtaining detailed spectral information in the mid-infrared region of the spectrum, which makes it an important

technique for analyzing crystallization procedures in the pharmaceutical industry. FTIR spectroscopy is especially useful for analyzing and identifying different polymorphic forms of a drug substance. When combined with sophisticated chemometric analysis methods such as Partial Least Squares (PLS), Principal Component Analysis (PCA), and Multivariate Statistical Process Control, FTIR spectroscopy is capable of quickly analyzing complex spectral information. This makes it possible to accurately determine the polymorphic content of a sample, even when it contains multiple polymorphs simultaneously[19].

3.7 Other PAT Tools

Optical Coherence Tomography (OCT) enables the observation of the inside of tablet and pellet coatings without damaging them, providing cross-sectional images in real time during the process. This enables the measurement of coating thickness, verification of even coating, and detection of any surface defects in pan-coated products[20].

4. Applications of Process Analytical Technology in Pharmaceutical Manufacturing

Process Analytical Technology has emerged as a necessary strategy in the current pharmaceutical manufacturing sector. It assists the companies in understanding and controlling their process in real time. Rather than relying solely on the final testing of products, PAT employs real-time analysis and intelligent tools and methods to track every step of the manufacturing process. This enables the companies to detect any variation at an early stage and make sure that every batch of the product meets the necessary standards of quality.

The applications of PAT for monitoring critical quality attributes during different pharmaceutical manufacturing processes are summarized in Table 3.

Table 3: Applications of PAT for monitoring of Critical Quality Attributes during Pharmaceutical Manufacturing

Process	Type of Equipment used	Critical quality attributes monitored during process	PAT Tools / Techniques/Models used	Key References
Blending		Blending uniformity	NIR System	[21]
		Drug Content	NIR Spectrometer	[22]
Granulation	High-shear mixer wet-granulator	Moisture content	MEMS-FPI NIR Spectrometer	[23]
		Density Moisture content, Granule size	AOTF-NIR Spectrometer	[24]
	Fluidized-bed Granulator	Moisture content	MicroNIR PAT-U Spectrometer	[25]
	Roller Compactor	Ribbon Density	CDI no-contact diffuse reflectance spectrometer	[26]
Drying	Lyophilizer	Solid state, Release of hydrate	Raman Spectrometer, NIR Spectrometer	[27]
	Fluidized-bed Dryer	Moisture content	Electrical capacitance tomography	[28]
Coating	Pan Coater	Drug content	PhAT system	[29]
		Coating thickness, Coating uniformity	Photodiode array Spectrometer, TPI Image 2000	[30]

	Fluidized-bed Coater	Drug content	Thermo scientific Antaris-II FT-NIR process analyzer	[31]
Tableting	Direct compression	Tablet hardness	NIR Spectrometer	[32]

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5. Benefits of PAT over Traditional Manufacturing Methods

Process Analytical Technology (PAT) improves product quality and consistency by facilitating a more efficient and well-designed manufacturing process. One of the greatest advantages of PAT is its capability to produce real-time process information, which can be obtained using three main methods:

- **At-line:** The sample is taken out of the process and analyzed in the vicinity, but still in close proximity to the production process.
- **On-line:** The sample is removed from the process for measurement and can be put back into the process after analysis.
- **In-line:** The measurement is made directly in the process stream, without removing the sample, using either invasive or non-invasive sensors[1].

The traditional quality control process involves large volume sampling of raw materials, intermediates, and final products, which results in delays in manufacturing. PAT overcomes this problem by allowing fast, non-destructive, and real-time analysis of the product using techniques such as near-infrared (NIR) spectroscopy. This enables the operator to make immediate process adjustments whenever required. In biopharmaceutical manufacturing, particularly in cell growth, traditional process monitoring involves complicated and costly offline analysis to assess nutrient levels, waste products, and culture viability. PAT improves this by enabling the continuous, real-time monitoring and control of these key process variables in the process itself. While traditional processes rely almost entirely on established specifications such as USP, for instance, PAT is based on a more profound understanding of the relationship between formulation and processing variables and the resulting product. Through the integration of PAT and risk-based controls, manufacturers can now easily identify any process deviations and make necessary adjustments to critical process parameters to ensure consistent product quality. In general, PAT enhances process reliability, shortens manufacturing time, improves productivity, and helps to move away from the traditional three-batch validation process to a more contemporary method of continuous and ongoing validation[33].

6. Key Challenges in PAT Adoption

- The integration of sensors into pharmaceutical manufacturing processes such as hot-melt extrusion

is challenging because it could interfere with the manufacturing process.

- Establishing effective sampling systems for the collection of real-time data from fast-moving and complex production lines is technically challenging and prone to errors.
- Processing large amounts of complex and noisy data from monitoring devices requires advanced data processing and cleaning methods.
- Building accurate models that interpret varied types of data takes specialized skills in data science and chemometrics.
- Integrating these predictive models smoothly with automated control systems for instant process adjustments remains an ongoing technical challenge.
- Fully calibrating and validating these analytical methods to keep them reliable under changing conditions and quality requirements consumes considerable time and resources [34].

7. Research Gap

- **Limited commercial-scale implementation:** The majority of PAT applications have been shown in the laboratory or pilot-scale operation, while very few studies have been reported where PAT systems have been used in the long term under commercial manufacturing conditions.
- **Missing end-to-end process integration:** The existing work predominantly revolves around the individual unit operations, whereas the holistic PAT approaches involving more than one related process have yet to be adequately explored, especially for continuous processing.
- **Insufficient data management plans:** Although enormous data is produced by PAT technologies, the standardization of data integration, fusion, and storage in a real-time setting and cybersecurity aspects is presently a developing area.
- **Few case study analyses based on regulations:** Even though guidelines for ICH support the implementation of PAT, examples of successful regulatory approvals for PAT-based RTR testing and post approval changes are very limited for publicly available information.
- **Underutilization of advanced analytics:** The use of advanced data analytics, machine learning, and artificial intelligence concepts for predictive control and autonomous decision-making processes within PAT paradigms is still at a very nascent stage.
- **Inadequate emphasis placed on material variability:** The effects of raw material variability in PAT models and control approaches are not

represented properly in existing literature despite its considerable influence on consistency in processes.

8. Conclusion

Process Analytical Technology (PAT) continues to reshape pharmaceutical manufacturing through real-time monitoring and precise control of key quality attributes and process parameters during essential steps like blending, granulation, drying, coating, and tableting. Tools such as NIR spectroscopy, Raman spectroscopy, hyperspectral imaging, mass spectrometry, and acoustic resonance spectroscopy deliver accurate insights into critical factors—blend uniformity, moisture levels, granule size, and coating thickness—directly connecting manufacturing performance to final product quality.

When combined with Quality by Design (QbD) principles and advanced data analysis techniques, PAT creates a strong foundation for deeper process knowledge, effective risk management, and real-time quality decisions. This move away from conventional end-product testing toward ongoing process oversight improves consistency, cuts down variability, and paves the way for continuous manufacturing with clear gains in efficiency, scalability, and regulatory ease. Moving forward, ongoing improvements in PAT sensors, data analytics, and automation promise more sustainable production, less waste, faster product delivery, and better access to reliable medications for patients everywhere.

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