

VUCA, Health, and Biostatistics: India's Challenge

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ABSTRACT

In a world increasingly characterized by Volatility, Uncertainty, Complexity, and Ambiguity (VUCA), health systems, especially in developing countries, face significant operational and strategic challenges. This article explores how health economics, supported by biostatistics and data science, can help navigate these challenges. Using India as a case study, we examine the stress points in health financing, data infrastructure, and policy implementation. We propose a systems-thinking approach leveraging data-driven models, predictive analytics, and cost-effectiveness evaluations to build resilient and inclusive health systems. The findings underscore the crucial need for integrated, context-specific strategies to achieve health equity and efficiency in a VUCA environment.

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INTRODUCTION

The 21st century marks an era defined by **VUCA (Volatility, Uncertainty, Complexity, and Ambiguity)**, posing formidable challenges across global systems, particularly in health care and shaping the way governments plan for health, particularly in developing countries. Global challenges like climate change, pandemics, geopolitical instability, economic inequalities, and rapid technological evolution have exposed the fragility of health systems, especially in low-and middle-income countries (LMICs). Health economics has emerged as a critical tool for managing limited resources, prioritizing interventions, and making informed policy decisions.

These stressors reveal the critical role of health economics in guiding the rational allocation of limited resources and optimizing policy outcomes. The COVID-19 pandemic demonstrated not just the fragility of healthcare infrastructure but also the urgent need for predictive tools and robust data systems. In this turbulent global landscape, biostatistics and data science play a pivotal role in interpreting evidence, predicting trends, and evaluating outcomes, all essential for

evidence-based policymaking. When integrated with health economics, these fields can drive more resilient, responsive, and equitable healthcare systems.

Understanding the concept from biostatistician's perspective

The Venn diagram (Figure 1) visually represents the interrelated components of the VUCA framework as it applies to health systems. Each circle denotes a major stressor: Volatility signifies sudden health crises like outbreaks (e.g., COVID-19, Zika, Nipah) that destabilize already fragile systems; Uncertainty reflects unpredictable disease patterns and inconsistent policy responses, making long-term planning difficult; and Complexity captures the involvement of multiple stakeholders such as public, private, and informal leading to coordination challenges. At the intersection of all three lies Ambiguity, highlighting how inadequate or poor-quality data leads to misinformed decisions and suboptimal health outcomes. The diagram emphasizes that ambiguity is not a standalone issue but the compounded

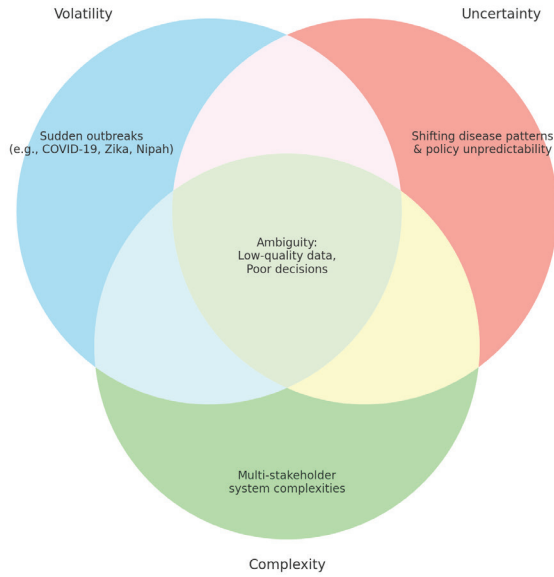


Figure 1: Intersections of VUCA Forces in Health Systems: Ambiguity as a Composite Challenge.

effect of volatility, uncertainty, and complexity, demanding integrated, data-informed, and flexible health strategies to overcome it.

This diagram thus provides a systems thinking approach to health sector reform, highlighting that ambiguity cannot be resolved in isolation. Instead, it must be addressed through resilience-building strategies that simultaneously reduce volatility (e.g., through early warning systems), manage uncertainty (via. better forecasting models) and streamline complexity (by strengthening institutional coordination).

A WHO's World Health Statistics (2025) report noted that over 60% of LMICs lack a robust health information system capable of real-time monitoring and resource allocation, and do not have real-time health surveillance systems.¹ This gap is more than a technical issue as it undermines trust, slows down interventions, and increases health inequities. Volatility from disease outbreaks, uncertainty in health financing, complexity in service delivery systems, and ambiguity due to data quality gaps undermine effective health service delivery. This restricts timely interventions, making health planning reactive rather than proactive. Understanding these dynamics through a biostatistical lens allows the modeling of disease burden, projected service needs, and cost-efficiency of interventions.

India's Health Economics Landscape in a VUCA World

Systemic Volatility and Economic Constraints: India faces the classic paradox of being the world's most populous country with a per capita health expenditure of around ₹5,300 (~\$65) among the lowest globally (NHA, 2023). Despite initiatives

like Ayushman Bharat (PM-JAY), healthcare financing remains largely out-of-pocket (OOP) (~48.2% of total health expenditure as per 2022 estimates), exacerbating financial vulnerability.²

Pandemic Lessons and Emerging Complexities: COVID-19 unveiled both the strengths and weaknesses of India's health apparatus. While vaccination campaigns succeeded in reaching a billion people, the second wave revealed cracks in oxygen supply chains, hospital readiness, and rural outreach. This volatility underscored the need for cost-effectiveness evaluations, predictive modeling, and targeted resource allocation.³⁻⁵

Biostatistics and Data Science in Action: Biostatistics and data science are central to transforming health economics from theoretical models to actionable insights. Key roles include:

- Disease burden estimation through DALYs and QALYs
- Cost-effectiveness and cost-utility analyses
- Forecasting demand for medical supplies and the health workforce
- Equity audits using spatial and demographic data
- Evaluating the impact of interventions through randomized trials and observational studies.

Tools such as R, Python, and health modeling platforms are increasingly used for epidemic forecasting, resource allocation optimization, and real-time policy monitoring. In a comprehensive timeseries modelling analysis drawing on the Global Burden of Disease Study 2021, quantified the indirect burden of the COVID-19 pandemic across 174 health conditions in 204 countries and territories. Their findings reveal a striking surge in non-COVID disease burden: age-standardized DALYs increased by approximately 12–14% for depressive and anxiety disorders, by 12% for malaria (especially in young children in Africa), and by a similar magnitude for stroke and ischemic heart disease in populations aged 70+. These results highlight how health system disruptions during the pandemic amplified challenges across both communicable and non-communicable diseases, underscoring the need to address multi-dimensional shocks in future preparedness efforts.³ Another article published in *Nature Scientific Reports* explores disparities in healthcare efficiency across Indian districts. Using a Data Envelopment Analysis (DEA) framework, it finds that many districts are underperforming in terms of health infrastructure utilization, especially in rural and tribal regions. The study highlights how resource allocation and policy targeting can be optimized using such quantitative models, offering a valuable tool for public health planning in VUCA environments.⁶

This syndemic perspective supports the argument for integrated surveillance, robust primary health infrastructure, and data-driven planning principles central to health

economics and biostatistical modeling in navigating VUCA health environments, particularly in LMICs like India.

ICMR and AIIMS have increasingly used real-time disease surveillance platforms. India's National Digital Health Mission (NDHM) is building a unified health data infrastructure. Localized data from Aarogya Setu and CoWIN became pivotal for resource planning.^{7,8} Despite government initiatives to expand internet access, large portions of rural India remain data dark zones, where critical gaps persist in mortality tracking, malnutrition statistics, and NCD (Non-Communicable Disease) registries. Among the elderly (60+), healthcare utilization is notably higher in urban India (96%) compared to rural India (89%), a 7 percentage-point gap highlighting rural access constraints. Public facilities are used more in rural areas (approx. 40% of services), whereas urban elderly predominantly use private clinics (43.5%). These figures illustrate structural inequities in access and the need for differential strategies in VUCA responses across geographies.⁹

Nationally, 60% of healthcare services are accessed in private facilities vs ~20% in public facilities, showing a strong private sector role across all demographics. Rural and urban households face different barriers: approx. 28% of rural and approx. 20% of urban households report financial constraints restricting care seeking.¹⁰ Socio-economic vulnerability, especially under crisis stress, directly impacts utilization, a key consideration in VUCA planning.

Women from female-headed households are approximately 19% less likely to fully utilize maternal health services than those from male-headed households. Some initiatives (e.g., Aam Aadmi Clinics in Punjab) reported 54% of all OPD visits were by women,¹¹ a positive data point on gender-inclusive utilization when targeted policies exist. These patterns show how gender interacts with socio-structural variables, reinforcing the role of biostatistics in identifying inequities during crises.

Only approximately 43.5% of women in rural India fully utilize the maternal and newborn care continuum, indicating substantial gaps in essential service uptake.¹² This further demonstrates that crisis readiness requires not just access but continuity of care, an area where biostatistics can model risk and guide intervention packages.

Approximately 72% of India's population lives in rural regions, yet these areas suffer from major infrastructure shortfalls: over 80% of community health centres lack specialist doctors and many PHCs are not working 24/7.¹³ VUCA shocks (like pandemics) stress systems with weak infrastructure disproportionately, a crucial point in health systems resilience planning.

India, with its vast population of approximately 1.46 billion and resource constraints, exemplifies both the

challenges and opportunities in a VUCA world. Despite significant strides like the Ayushman Bharat scheme, public health expenditure remains at approximately 2.1% of GDP.^{7,14} Health financing continues to be dominated by out-of-pocket payments, pushing vulnerable households into poverty. COVID-19 exposed gaps in oxygen supply chains and critical care capacity, reinforcing the need for scenario planning, cost-effectiveness analysis, and predictive analytics.

USAID's Exit and Building Sustainable Futures

The recent exposure that USAID abruptly shut down funding for a landmark multi-year health systems research initiative, led in part by *The Lancet Commission on Reimagining the Future of Health*,¹⁵ has raised serious ethical and operational concerns, particularly for developing countries. Our immediate feeling is a mix of frustration and profound concern. Challenges are significant: We anticipate the loss of vital support for critical projects in healthcare, education, and infrastructure, potentially disrupting years of progress and affecting vulnerable communities. However, this challenge also gives us a chance to rethink how we move forward. It reminds us of the need to become more self-reliant, build stronger local systems, and diversify our partnerships so, we aren't dependent on one source of support. Though this situation is difficult, we remain committed to a future where we take greater leadership in our development journey.

The now-canceled program was meant to help countries build fairer and stronger health systems after COVID-19. Unfortunately, it was shut down before its results could be shared. Experts believe this decision blocked important findings about health inequalities, access problems, and how aid is often unfairly distributed—information that could have helped countries prepare better for future health emergencies.¹⁶

This incident highlights a bigger issue: depending too much on foreign aid without clear rules or local control is risky. While USAID has played a major role in global health for many years, this situation shows how political decisions can suddenly impact public health. It also makes clear the need for locally led research, open sharing of knowledge, and better protections to ensure that vital health work isn't cut off without warning.

Correspondingly, World Health Organization (WHO) is facing a deeper financial crisis than previously estimated, with a projected \$2.5 billion budget shortfall for the 2025–2027 cycle, according to a report by *Health Policy Watch*.¹⁷ This growing gap threatens the agency's ability to deliver on its global commitments, especially in pandemic preparedness, health systems strengthening, and support to low- and middle-income countries (LMICs). The shortfall is attributed to donor fatigue, competing global crises, and a continued

reliance on voluntary earmarked contributions, which now comprise nearly 80% of WHO's funding. For countries like India, which depend on WHO technical guidance, surveillance systems, and emergency response support, the implications are significant. It underscores the urgent need for predictable, flexible, and sustainable financing models, as well as regional resilience, where nations build stronger local institutions and reduce their dependence on volatile global funding landscapes.

The abrupt closure of global health initiatives like the USAID-funded Lancet program reminds us that sustainable progress in developing countries depends not on external generosity but on internal preparedness, ownership, and the courage to lead our health futures. The WHO's deepening budget crisis is a stark reminder that global health security cannot depend on fragile funding streams but must be anchored in sustainable, locally supported systems.

Proposed Strategies for India and LMICs

To build resilience in health systems, developing countries need to adopt an integrated strategy:

- Strengthen health financing through risk pooling and expanded coverage of outpatient services.
- Invest in health information systems that allow interoperability and real-time decision-making.
- Foster public-private partnerships for scalable health tech infrastructure.
- Promote the use of open data platforms to support academic and grassroots research.
- Build institutional capacity in health economics and biostatistics to support evidence-based policy.
- Establishing national health research funds that ensure continuity of critical studies irrespective of donor exits.
- Fostering South-South collaborations with regional institutions to reduce overreliance on high-income country aid.
- Mandating open-access data and publications for all government-supported research to improve transparency and policy uptake.
- Integrating research outputs into national health strategies through regular stakeholder-policy dialogues.
- Prioritizing Robust, Locally-Driven Data Infrastructure and Analysis Capacities
- Fostering Open Science Principles and Data Sharing for Global Health Resilience
- Promoting Causal Inference and Fair Distribution Analysis of Health Interventions and Aid: This focuses on ensuring that even with fluctuating funding, the core ethical and scientific questions about *what works, for whom, and how fairly* aid is distributed are systematically addressed,

providing robust evidence for building truly equitable and resilient health systems.

CONCLUSION

In the face of a VUCA world, traditional health planning approaches are inadequate. Biostatistics and health economics provide the intellectual tools needed to respond adaptively, especially in the context of India and other LMICs. Strategic investments in data infrastructure, academic capacity, and analytic frameworks will be crucial to navigate future uncertainties. India, given its scale and digital momentum, is uniquely positioned to lead this transformation.

Building resilient health systems in India and other LMICs demands a focus on data-driven integration and analytical empowerment. We need to optimize risk pooling through actuarial and predictive modeling, ensuring financial sustainability. Investing in real-time, interoperable data infrastructure with built-in quality controls is crucial for immediate insights. Public-private partnerships should be leveraged for ethical data linkage and innovation, fostering a comprehensive understanding of health. Ultimately, empowering countries to lead their health futures means strengthening local institutional capacity in health analytics and causal inference. This allows them to independently generate and apply evidence, transforming VUCA into a navigational tool for equitable and sustainable policies. In this context, health economics and biostatistics are not merely technical fields; however, they are strategic enablers of health system transformation in an uncertain world.

REFERENCES

1. WHS 2025. World health statistics 2025: monitoring health for the SDGs, Sustainable Development Goals. [Internet]. Vol. 49, Choice Reviews Online. Licence: CC BY-NC-SA 3.0 IGO; 2025. 49-6620-49-6620 p. Available from: <https://iris.who.int/bitstream/handle/10665/381418/9789240110496-eng.pdf?sequence=1>
2. Economic Liberalisation in India | Economic and Political Weekly [Internet]. [cited 2025 Jul 11]. Available from: <https://www.epw.in/journal/2008/26-27/special-articles/government-health-spending-india.html>
3. Chen C, Zhou W, Cui Y, Cao K, Chen M, Qu R, et al. Global, regional, and national characteristics of the main causes of increased disease burden due to the covid-19 pandemic: time-series modelling analysis of global burden of disease study 2021. *BMJ* [Internet]. 2025 Jul 2 [cited 2025 Jul 11];390:e083868. Available from: <https://www.bmj.com/content/390/bmj-2024-083868>

4. Wojcik O, Mshp M, E C, Plough AL. Aligning Health and Social Systems to Promote Population Health, Well-Being, and Equity. Vol. 110, American journal of public health. 2020. p. S176–7.
5. Hazra DK, Pujari BS, Shekatkar SM, Mozaffer F, Sinha S, Guttal V, et al. Modelling the first wave of COVID-19 in India. PLOS Comput Biol [Internet]. 2022 Oct 1 [cited 2025 Jul 11];18(10):e1010632. Available from: <https://journals.plos.org/ploscompbiol/article?id=10.1371/journal.pcbi.1010632>
6. Chatterjee B, Mande SC. Demography, sanitation and previous disease prevalence associate with COVID-19 deaths across Indian States. Sci Rep [Internet]. 2025 Dec 1 [cited 2025 Jul 11];15(1):1–12. Available from: <https://www.nature.com/articles/s41598-025-93622-0>
7. Economic Survey 2022-23: Health not a priority? Just over 2% of GDP spent [Internet]. [cited 2025 Jul 11]. Available from: https://www.downtoearth.org.in/health/economic-survey-2022-23-health-not-a-priority-just-over-2-of-gdp-spent-87403?utm_source=chatgpt.com
8. CoWIN in India: The Digital Backbone for the COVID-19 Vaccination Program | Exemplars in Global Health [Internet]. [cited 2025 Jul 11]. Available from: <https://www.exemplars.health/emerging-topics/epidemic-preparedness-and-response/digital-health-tools/cowin-in-india>
9. Banerjee S. Determinants of rural-urban differential in healthcare utilization among the elderly population in India. BMC Public Health. 2021 May 17;21(1):939. doi: 10.1186/s12889-021-10773-1. PMID: 34001026; PMCID: PMC8130530.
10. National Health Systems Resource Centre. Research to Action 2023. Ministry of Health & Family Welfare, Government of India, 2023. Available at: https://nhsrcindia.org/sites/default/files/2024-01/RESEARCH%20TO%20ACTION%202023_0.pdf (accessed Dec 2025).
11. Ghatak, S., & Dutta, M. (2024). Utilizing maternal healthcare services: are female-headed households faring poorly? BMC Pregnancy and Childbirth, 24, 299. <https://doi.org/10.1186/s12884-024-06445-8>
12. Tripathi P, Chakrabarty M, Singh A, Let S. Geographic disparities and determinants of full utilization of the continuum of maternal and newborn healthcare services in rural India. BMC Public Health. 2024 Dec 5;24(1):3378. doi: 10.1186/s12889-024-20714-3. PMID: 39639301; PMCID: PMC11619281.
13. Kamei, Gaikhangduanliu M. "Urban-Rural Divide in Healthcare Access." Adhyayan Foundation for Policy and Research (AFPR), 2024, <https://afpr.in/urban-rural-divide-in-healthcare-access/>. Accessed Dec 2025.
14. Blanchard J; Washington R; Becker M; Al VNMKSR et. Vision 2035 Public Health Surveillance in India, NITI AYOOG [Internet]. 2020. Available from: <https://www.niti.gov.in/sites/default/files/2023-03/Vision-2035-Public-Health-Surveillance-in-India.pdf>
15. PTI. Lancet study projects US foreign aid cuts could result in over 1.4 crore preventable deaths globally [Internet]. The Economic Times, July 1, 2025. 2025. Available from: <https://economictimes.indiatimes.com/news/international/global-trends/lancet-study-projects-us-foreign-aid-cuts-could-result-in-over-1-4-crore-preventable-deaths-globally/articleshow/122178516.cms?from=mdr>
16. Anderson S. USAID Formally Shut Down – Days After Scientists Warn Closure Will Kill 2.4 Million People Every Year [Internet]. Health Policy Watch, July 2 , 2025. 2025 [cited 2025 Jul 22]. Available from: <https://healthpolicy-watch.news/usaid-shut-down-lancet-millions-deaths/>
17. Fletcher ER. WHO Budget Crisis Bigger Than Previously Thought – \$2.5 Billion Gap for 2025-2027. Health Policy Watch, February 4, 2025. 2025.