Learning Analytics Definitions

the "collection and analysis of usage data associated with student learning. The purpose of [learning analytics] is to observe and understand learning behaviors in order to enable appropriate interventions."

EDUCAUSE Learning Initiative. (2011, April). Learning analytics: The coming third wave (brief). Louisville, CO: EDUCAUSE. Retrieved from https://library.educause.edu/~/media/files/library/2011/4/elib1101-pdf.pdf

"the measurement, collection, analysis, and reporting of data about learners and their contexts, for the purposes of understanding and optimizing learning and the environments in which it occurs."

Conole, G., Gasevic, D., Long, P., & Siemens, G. (2011). Message from the LAK 2011 general & program chairs. *Proceedings of the 1st International Conference on Learning Analytics and Knowledge*, LAK 2011. Banff, AB, Canada.

Actions or interventions intended to improve student outcomes

Setting policies, defining processes, making referrals, sending notifications, prompting student meetings ... in near real time

ECAR-ANALYTICS Working Group. *The Predictive Learning Analytics Revolution: Leveraging Learning Data for Student Success*. ECAR working group paper. Louisville, CO: ECAR, October 7, 2015.

7 things you should know about analytics. (2011, April). *EDUCAUSE Learning Initiative*. Retrieved from https://net.educause.edu/ir/library/pdf/ELI7059.pdf

http://er.educause.edu/articles/2011/9/penetrating-the-fog-analytics-in-learning-and-education

Learning Record Stores

Integrated Planning & Advising for Student Success (IPASS) Systems

Early Alert Systems

Engagement Systems

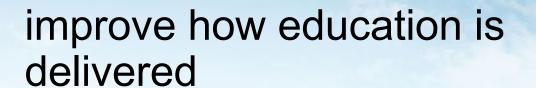
High-Risk High-Priority High-Flier

ing Learning Data for Student Success. ECAR working group paper. Louisville, CO: E Learning Initiative. Retrieved from

ECAR, October 7, 2015; 7 things you should know about analytics. (2 https://net.educause.edu/ir/library/pdf/ELI7059.pdf

CAR-ANALYTICS Working Group. The Predictive Learning Analyti

http://er.educause.edu/articles/2011/9/penetrating-the-fog-analytics-in-learning-and-education



identify learners who can benefit from interventions

provide learners with insight into their own learning habits

ECAR-ANALYTICS Working Group. The Predictive Learning Analytics Revolution: Leveraging Learning Data for Student Success. ECAR working group paper. Louisville, CO: ECAR, October 7, 2015.
7 things you should know about analytics. (2011, April). EDUCAUSE Learning Initiative. Retrieved from

/ things you should know about analytics. (2011, April). EDUCAUSE Learning Initiative. Retrieved from https://net.educause.edu/ir/library/pdf/ELI7059.pdf

http://er.educause.edu/articles/2011/9/penetrating-the-fog-analytics-in-learning-and-education

Creating an Institution-Wide Data Eco-system

Lance C. Kennedy-Phillips, Ph.D.
Vice Provost for Planning and Assessment
Pennsylvania State University



Penn State's Data and Analytics Vision Statement

Vision Statement:

Trusted Insights

Empowering Penn State



Build Trust in the Data

 Build and communicate a shared language to foster common understanding.



Unlock the Data

 Deliver the data to decision makers at the right time in the right format.



Empower the University

 Maximize the power of a data-informed decision culture to drive results





Development of an analytics & BI ecosystem



Engage the University community for input and feedback through all phases



Develop the business glossary and the system of data governance



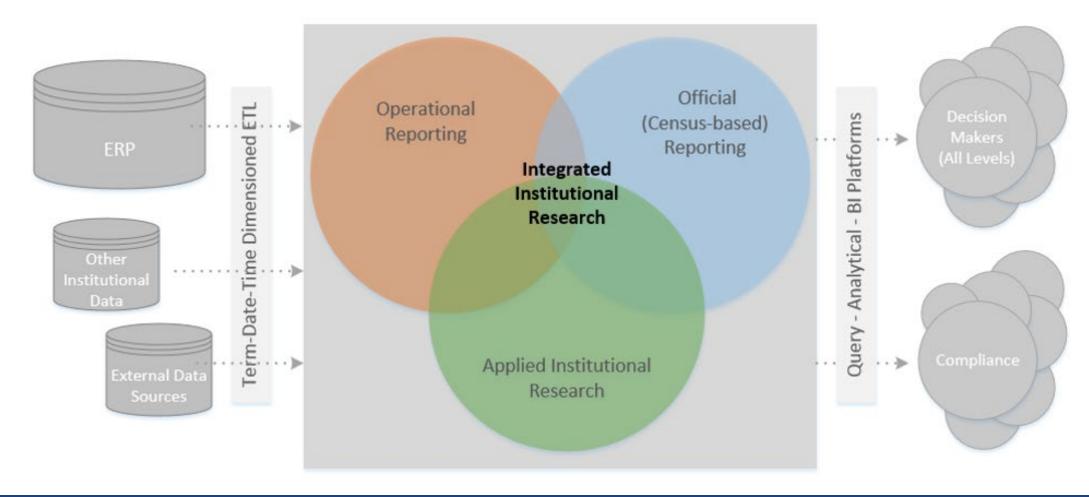
Develop and rollout subject area and crossfunctional data in phases



Socialize and train in data governance, data, and the data ecosystem

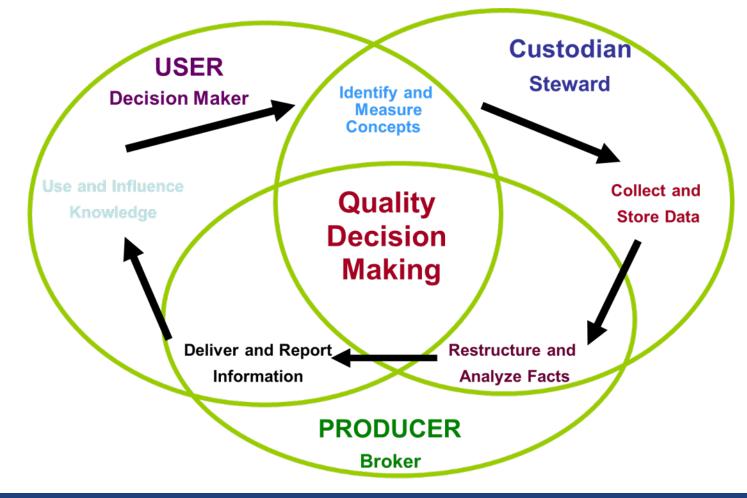


Creating a Data Infrastructure



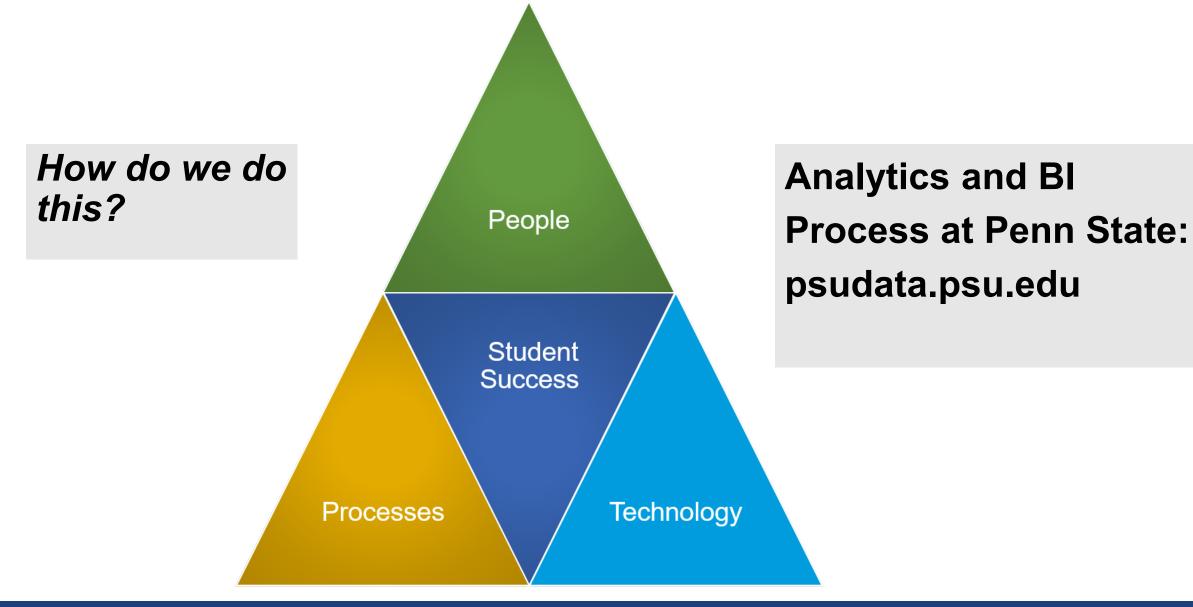


Tying it all together...















Connecting Libraries and Learning Analytics for Student Success



These projects were made possible in part by the Institute of Museum and Library Services [LG-98-17-0019-17; LG-97-18-0209-18]. The views, findings, conclusions or recommendations expressed in this presentation do not necessarily represent those of the Institute of Museum and Library Services.

- Instruction Session
- Reference Transaction
- Exhibit or event

Participated in Intervention

- Library Facility
- Learning Commons
- Study Room
- Presentation Room
- MakerSpace
- Lab

Accessed Library Actions

Article

- eBook
- Institutional Repository
- Library Computer
- Library Printer/Copier

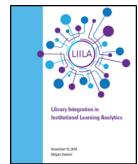
Checked Out

Book

Attended

- eReserve
- ILL
- Technology

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Oakleaf, Megan, Whyte, Anthony, Lynema, Emily and Malcolm Brown. "Academic Libraries & Institutional Learning Analytics: One Path to Integration." *Journal of Academic Librarianship*. 43(5). 454–461. 2017.

Possible Librarian Roles in Learning Analytics

Communication

- Engage in discussions about learning analytics across the institution
- Convene
 institutional or
 cross-institutional
 discussions about
 learning analytics

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Policy & Procedure Activism

- Shape policies governing the deployment and use of learning analytics
- Establish
 procedures for
 learning analytics
- Advocate for data security and privacy

Participation

- Participate in institutional learning analytics by contributing library data
- Determine the library data to contribute (or withhold) from learning analytics systems
- Experiment and innovate in learning analytics

Meaning Creation

- Consult on meaningful data ingested into learning analytics systems
- Provide
 expertise in data
 science,
 curation,
 stewardship,
 metadata,
 taxonomies,
 classification,
 and visualization
- Demonstrate and articulate the value of information revealed by learning analytics

Action

- Collaborate to act upon findings revealed by learning analytics
- Intervene with students seeking assistance through or identified by learning analytics efforts



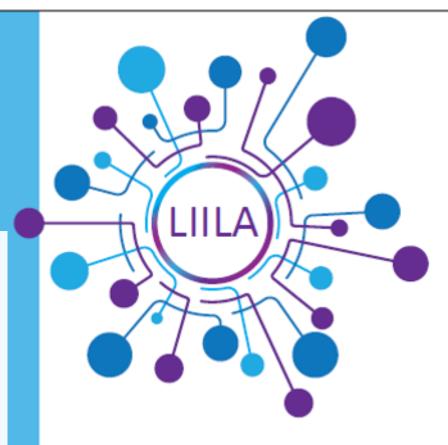
When Roles Collide:

Librarians as Educators and the Question of Learning Analytics

Megan Oakleaf, Malcolm Brown, Dean Hendrix, Joe Lucia, Scott Walter*

Introduction

Learning analytics, the "collection and analysis of usage data associated with student learning...to observe and understand learning behaviors in order to enable appropriate interventions," is no longer a new idea in higher education. Rather, learning analytics is an established area of cross-institutional cooperation on many campuses. As learning analytics evolves from a novel approach to an accepted strategy for investigating and supporting student success, librarians have an opportunity to consider ways in which they might collaborate with institutional partners who are already engaged in learning analytics and contribute their unique outlook and expertise to this endeavor.



Library Integration in Institutional Learning Analytics

November 15, 2018 Megan Oakleaf

Increase Professional Awareness and Discussion

- Seek out readings, conferences, and other opportunities to learn about learning analytics.
- Connect with other librarians to discuss the role of the library in learning analytics.
- Invite stakeholders including students and faculty to engage in conversations about library involvment in learning analytics.

Be Informed and Forthright about Current Data Practices

- Investigate library systems to determine how data is gathered, maintained, secured, stored, and used.
- Investigate partner systems connected to the library (i.e. institutional, vendor) to determine how data is gathered, maintained, secured, stored, and used.
- Determine whether opt-in and opt-out choices are available and how data generated in each category is utilized.
- Be transparent about data gathering, maintenance, security, storage, and use and communicate rationales for data use.

Communicate and Negotiate with Vendor and Institutional Partners

- Determine who owns or has access rights to data maintained in vendor and institutional systems.
- Work with local procurement officer(s) to ensure that data ownership and access rights are part of contract negotiations.

Situate Learning Analytics among Other Assessment Approaches

- Recognize that learning analytics is one tool for assessing student learning and success and identifying
 ways to support students in achieving their goals.
- Acknowledge the strengths and weaknesses of all assessment approaches and pursue the approach that
 best fits the problems to solve, questions to answer, and students to support.

Engage the Learning Analytics Conversation at the Institutional Level

- Connect with learning analytics personnel, committees, and systems at the institutional level.
- Contribute librarian knowledge, skills, abilities, and values to institutional learning analytics efforts.

Identify and Analyze Questions or Problems Meriting a Learning Analytics Approach

- Identify the issues, interests, areas of concern, and other priorities appropriate for investigating via learning analytics.
- Identify and prioritize stakeholder groups that can most benefit from learning analytics inquiry.

Envision Library Data Contributions

- Identify library services, areas of expertise, resources, or facilities are most likely to contribute to student learning and success.
- Inventory the data emitted from the library services, areas of expertise, resources, or facilities most likely to contribute to student learning and success.
- Imagine data that may be instrumented and collected from impactful library services, areas of expertise, resources, or facilities.

Explore Interoperability Standards

Consider ways to link data "silos" using interoperability standards.

Identify Key User Stories

- Prioritize library and learning analytics user stories likely to result in contributions to student learning and success.
- Develop prioritized user stories into detailed use cases.

Pursue Pilot Studies

Develop pilot studies to investigate the feasibility and usability of highly ranked user stories and use cases.

Figure 10. Possible Next Steps for Library Integration into Institutional Learning Analytics