





Data Quality/Information Quality

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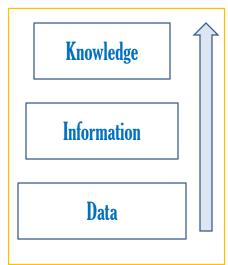
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Outline

- Introduction to Data Quality
 - Definitions
 - Data Quality in Healthcare
 - Data Quality Dimensions
 - Poor Quality Data
- Data Quality in (Surgical) Pathology
 - Variability in Free Text Pathology Reporting
 - Coding and Standards
 - Synoptic Reporting
 - Structured Data
 - Report formatting

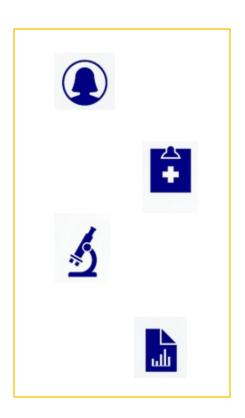
Basic Definitions

- Data = raw facts (ex. blood glucose level)
 - May describe a particular event/specific observation
- **Information** = processed data (anything from explanations to formal analysis)
 - Cannot create information without data
- Knowledge = Information applied to rules, experiences and relationships with the result that it can be used for decision making (ex. heparin prevents clotting of blood)
- Cannot pinpoint where data ends and information begins
 - Same data may provide different information to different users
 - One person's data may be another person's information
 - More important to understand relationship between data and information



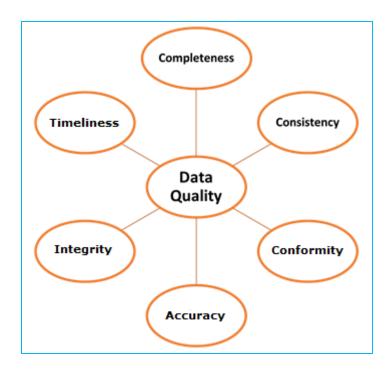
Types of Data in Pathology

- Patient name and demographics
- Responsible physicians/staff/technicians
- Dates/Times
- Specimen Types/Procedure
- Clinical History
- Tests ordered
- Laboratory Results
- Molecular/Genetic Results
- Pathology Reports
 - Gross Description
 - Microscopic Description
 - Final Pathologic Diagnosis
- Billing information/codes
- Imaging
- etc...



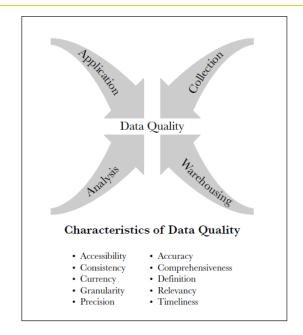
Data Quality

- More than just data accuracy
- Data quality cannot be assessed without data quality standards
- Dimensions of data quality
 - Method to measure data quality
 - Established for a variety of industries/businesses
- No universally recognized set of health care data quality standards
 - Quality of data needed in any situation is driven by how data will be used



Data Quality in Healthcare

- American Health
 Information
 Management
 Association (AHIMA):
 Data Quality
 Management Tool
 - Guidance to assist
 health care
 organizations in
 establishing data quality
 standards



Application - The purpose for which the data are collected.

Collection – The processes by which data elements are accumulated.

Warehousing – Processes and systems used to archive data and data journals.

Analysis – The process of translating data into information utilized for an application.

Defines characteristics of data quality that can be applied to application, collection, warehousing and analysis of data in healthcare

Data Quality Characteristics

- Data accuracy = data are the correct values and are valid (ex. typographical error)
 - Syntactic accuracy permissible value
 - Semantic accuracy closeness to true value (correctness)
- Data accessibility = data items should be easily obtainable and legal to collect (can't access data it's of no use)
- Data comprehensiveness = all required data elements are included (data not useful if not complete)
- Data consistency = value of the data should be reliable and same across applications (ex. use of an abbreviation that has two different meanings)
- Data currency = data should be up-to-date (many data become obsolete after a period of time)

Data Quality Characteristics

- Data definition = clear definitions should be provided so that current and future data users will know what the data mean (ex. use of data dictionaries)
- Data granularity/atomicity = attributes and values of data should be defined at the correct level of detail (ex. patient name recorded as three data elements: last name, first name, middle name)
- Data precision = how close to an actual size, weight or other standard a particular measurement is
- Data relevancy = data are meaningful to the performance of the process or application for which they are collected
- Data timeliness = defined by how data are being used and their context

Data Errors

- Data error = failures of data to meet established quality standards
 - Have negative impact on one or more of the characteristics of data quality
- Systematic errors = flaw or discrepancy in adherence to standard operating procedures or systems
- Random errors = due to carelessness rather than lack of training (ex. transcription error)

Potential Causes of Poor Quality Data

Systematic Errors

- Unclear data definitions
- Poor interface design
- Programming errors
- Guidelines not adhered to
- Lack of sufficient data checks
- No system for correcting detected errors
- Suboptimal data conversion
- System upgrades

Random Errors

- Illegible handwriting in data source
- Typing errors
- Frequent personnel turnover
- Calculation errors (not in system)

Effect of Poor Quality Data

- Medical Records Institute (MRI) = professional organization dedicated to improvement of patient records through technology
- Health care documentation has two parts
 - Data capture
 - Report generation

Both must be considered in order to have high quality data

- 5 major areas negatively effected by poor quality data
 - Patient safety
 - Public safety
 - Continuity of patient care
 - Health care economics
 - Clinical research and outcomes analysis

Methods for Improving Data Quality

Data Error Prevention

Compose a minimum set of necessary data items

Define data and data characteristics in a data dictionary

Develop a data collection protocol

Create user friendly data entry forms or interface

Compose data checks

Create a quality assurance plan

Train and motivate users

Data Error Detection

Perform automatic data checks

Perform data quality audits

Review data collection protocols and procedures

Check inter- and intraobserver varability (if appropriate)

Visually inspect completed forms (online or otherwise)

Routinely check completeness of data entry

Actions for Data Quality Improvement

Provided data quality reports to users

Correct inaccurate data and fill in incomplete data detected

Control user correction of data errors

Give feedback of data quality results and recommendations

Resolve identified causes of data errors

Implement identified system changes

Communicate with users

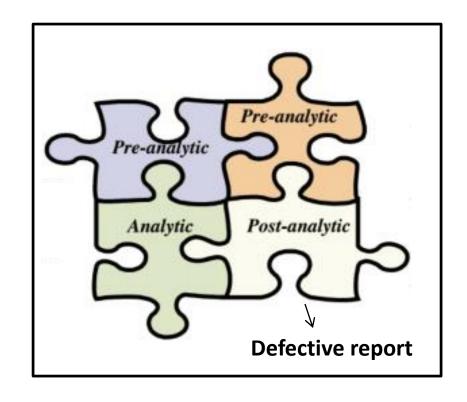
Data Quality in Pathology

- Errors can occur across all phases of the process of pathology
 - Preanalytic = receiving and preparing specimen
 - Analytic = interpretation
 - Postanalytic = conveying results to clinician

Data quality issues are generally much more complex in surgical /anatomic pathology compared to clinical pathology, especially in post-analytic phaserelating to data capture and reporting

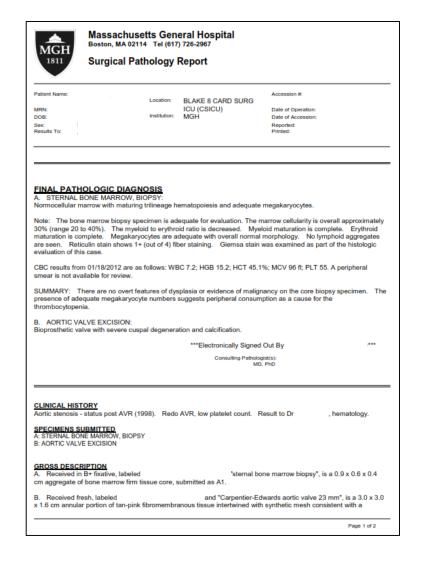
Data Quality in Surgical Pathology

- Quality in surgical pathology is determined by
 - Diagnostic accuracy
 - Report completeness
 - Timeliness
- Clear and comprehensible pathology reports



Reporting in Surgical Pathology

- Traditional pathology reports are written in free text
- Results in creation of a few large text fields correlating with specific parts of the surgical pathology report
 - Gross description
 - Clinical history
 - Final pathologic diagnosis
 - Etc.



Problems with Free Text Reports

- Variability in diagnostic terminology
 - Makes it difficult to combine/compare datasets
- Variability in reporting styles
 - Adds complexity to understanding the reports
- Variability in report content
 - Increases likelihood of reports missing important data elements (eg., margins, lymphatic invasion)

Improving Data Quality of Free Text Reports

- Natural language processing
- Coding
- Secondary review and amendment

Variations in Wording of Breast Diagnoses

- Breast pathology reports were analyzed using natural language processing software to extract information on specific breast diagnoses
- 76,333 breast pathology reports from 3 institutions
- Widespread variation in how pathologists reported common diagnoses
 - 124 variations in wording for invasive ductal carcinoma
 - 95 variations in wording for invasive lobular carcinoma
 - 14 variations in wording for atypical ductal hyperplasia

Atypical ductal hyperplasia

Atypical duct hyperplasia

Atypical intraductal hyperplasia

Atypical ductal epithelial hyperplasia

Atypical hyperplasia with ductal and lobular features

Atypical hyperplasia with mixed ductal and lobular features

Atypical lobular and ductal hyperplasia

Atypical ductal and lobular hyperplasia

Atypical hyperplasia, both typical, and atypical

Atypical hyperplasia is present with pagetoid spread in to ducts

Papillary duct hyperplasia with atypia

Classification of Free Text Reports by NLP

- Describes prototype natural language processing (NLP) system that automatically extracts lung cancer staging information from free text pathology reports
- Applied machine learning text categorization techniques to train machines using reports from 710 lung cancer patients
- Validated on a set of 179 patients
- Overall accuracy of 74% for tumor (T) stage, 87% for node (N) stage
- Works pretty well, but definitely not perfect....data for clinical decision support requires higher quality....

Coding Systems

- Way to represent a set of related real world concepts using defined codes or terms that are readily adaptable for use by data processing systems
- Range from simple list of concepts to complex multiaxial hierarchical structures with defined relationships among underlying concepts
- Provides a controlled terminology = finite set of terms with an agreed-upon meaning
- Allows users to communicate information with confidence

Coding: Key terms

- Concept = fundamental unit of meaning within a terminology or classification system (ex. ischemia)
- **Term** = word or phrase which names a particular concept
 - Multiple terms may convey the identical concept: ex. stroke and cerebrovascular accident
- Classification = system for organizing concepts in a particular area of knowledge into related groupings (ex. ICD-10-CM)
- **Terminology** or **nomenclature** = set of terms for concepts in a particular area of knowledge (ex. ICD-10-CM)
 - Definitions NOT required (unlike a vocabulary)
- Ontology = vocabulary that includes information about relationships among concepts (ex. SNOMED-CT)
- **Semantic relationships** = expressions of the connections between various concepts (ex. SNOMED-CT)

Coding Standards Important in Pathology

- CPT (Current Procedural Terminology)
 - Healthcare procedures (>8,500 terms)
 - Required for most billing transactions
- ICD-10-CM (International Classification of Disease, 10th Edition, Clinical Modification)
 - Disease and injury classification (68,000 codes)
 - Required for most billing transactions
- SNOMED-CT (Systematized Nomenclature of Medicine-Clinical Terms)
 - Broad-based medical nomenclature (>300,000 concepts)
 - Includes semantic relationships
 - Most complex coding system
- LOINC (Logical Observation Identifiers and Codes)
 - Set of numeric codes that identify a particular type of observation
 - Ensures that tests from two different labs are same.

Messaging Standards

- DICOM (Digital Imaging and Communications in Medicine) – image exchange standard
- HL7 (Health Level 7) clinical and administrative messaging standard
- CDA/CCD (Clinical document
 architecture/continuitiy of care document) –
 clinical document standards

Disadvantages of Coding Standards

- Complexity difficult to know which code to use
- Incomplete standards can't find specific code that you need

- Note on Autocoding: use NLP/text parsing to automatically code free text
 - Issues with negation, ambiguous findings (ex. most consistent with)

Data Quality in Pathology

- Healthcare documentation has two parts
 - Data capture
 - Report generation

Both must be considered in order to have high quality data

 Proactive/preventive: use more standardized terminology upfront when data is initially being captured

Argument for Synoptic Reporting

- Incomplete pathology reports
- Landmark retrospective study of 15,940
 pathology reports of colorectal cancer from 322
- Essential elements (gross tumor size, depth of tumor invasion, status of resection margins and tumor grades) were omitted from a significant portion of surgical pathology reports
- Use of a standardized report or checklist increased likelihood of complete report

Synoptic Reports

renal parenchyma.

- Terminology:
 "guidelines, protocols, templates, practice parameters, checklists"
- Provides uniform standardized data elements in the form of checklists to ensure that pathologists make note of these findings in their reports
- Data is summarized as a list of previously defined data elements

```
KIDNEY (LEFT): ADENOCARCINOMA
   MACROSCOPIC
      SPECIMEN TYPE: Radical Nephrectomy
     LATERALITY: Left
     TUMOR SITE: Upper pole
      FOCALITY: Unifocal
      TUMOR SIZE: Greatest dimension is 7.2 cm
     MACROSCOPIC EXTENT OF TUMOR: Tumor extends into major veins
   MICROSCOPIC
      HISTOLOGIC TYPE: Clear cell (conventional) renal carcinoma
      HISTOLOGIC GRADE: (Furhman Nuclear Grade): 2
   PATHOLOGIC STAGING (pTN)
      PRIMARY TUMOR (pT): pT3
      REGIONAL LYMPH NODES (pN): Nx
      Number of lymph nodes examined: 0
      Number of lymph nodes involved: 0
      MARGINS: Renal vein margin positive
      ADRENAL GLAND: Univolved
      VENOUS (LARGE VESSEL) INVASION (V)(excluding renal vein and inferior vena cava):
         Negative
      LYMPHATIC (SMALL VESSEL) INVASION (L): present
  ADDITIONAL PATHOLOGIC FINDINGS: Chronic glomerulonephritis present in non-involved
```

Benefits of Structured Synoptic Cancer Pathology Reports

- Significantly improves completeness of cancer reports across a broad range of tumor types
- Simplifies and prioritizes the recording of information
- Ensures that pathologists are kept abreast of the latest minimum reporting standards for all tumors
- Secondary users, such as cancer registries, can more efficiently extract meaningful staging and prognostic data than from narrative reports
- Improved information to support clinical *decision* making, i.e. increased clinician *satisfaction*

Some History....

- Early 1990's: a number of pathology professional societies began issuing recommendations specifying a minimum set of data elements that should be included in pathology reports for particular tissue types or pathologic diagnoses
- 2004: American College of Surgeons' Commission on Cancer required as a condition of cancer program accreditation that surgical pathology cancer reports contain validated or regularly used data elements in their reports for each site and specimen
- To facilitate this, College of American Pathologists (CAP) developed site-specific cancer protocols and checklists as a resource
- Today: CAP requires CAP-accredited laboratories to include all report elements specified in CAP cancer protocols in surgical pathology reports

CAP Cancer Protocols/Checklists

- Set of standardized protocols for the most commonly reported forms of cancer
- Goal: Improve quality and uniformity of information in pathology reports
- Developed by the CAP cancer committee
- Consist of data elements structured as a set of questions and prospective answers
- Staging is based on the AJCC Staging Manual
- Includes reference information and is updated periodically
- Available in doc and pdf versions
- Electronic cancer checklists (eCC) were released in early 2007 to advance use in computerized pathology reporting

CAP Electronic Cancer Checklists (eCC)

Implemented and overseen by the CAP PERT (pathology electronic reporting committee)

Benefits of the CAP eCC

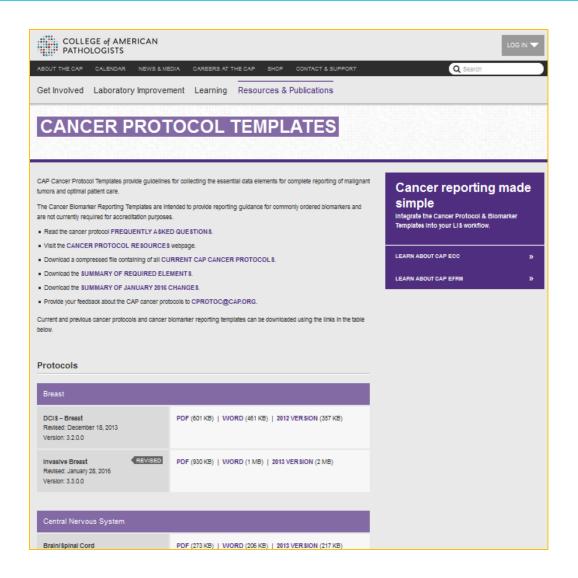
- Integrates into pathologist AP-LIS workflow
- Ensures each report is completed with the necessary required elements
- Improves and supports information exchange and data interoperability
 - Ckeys: provide unique codes for each data element in the CAP eCC
 - SNOMED CT
- Provides automated access to patient data through work with vendors

Vendors who integrate CAP eCC

- Cerner CoPathPlus
- Epic Beaker
- mTuitive (CAP's partner for CAP eFRM™) interfaces and/or integrations with:
 - Cerner Millennium
 - Cortex
 - Meditech
 - Sunquest Copath
 - Other LIS systems
- Novopath
- Psyche Systems
- Softworks Group
- Sunquest Powerpath
- Voicebrook

Note: eCC is available in a standardized software implementation using CAP eFRM

CAP Cancer Protocols



CAP Cancer Synoptic Reporting Format

- Data is displayed as required checklist item (required data element, RDE), followed by its answer (response), ex. "Tumor size: 5.5 cm"
- Each diagnostic parameter pair (checklist RDE: response) is listed on a separate line or in a tabular format, with a few exceptions:
 - Anatomic site or specimen, laterality and procedure
 - Pathologic Staging Tumor Node Metastasis (pTNM) staging elements
 - Negative margins, as long as all negative margins are specifically enumerated
- The synopsis can appear in the diagnosis section of the pathology report, at the end of the report or in a separate section, but all RDE and responses must be listed together in one location
- Additional items (not required for the CAP checklist) may be included in the synopsis but all required RDE must be present
- Narrative style comments are permitted in addition to, but are not a substitute for, the synoptic reporting.

Impact of Synoptic Reporting on Adequacy of Surgical Pathology Reporting in Cancer

- CAP Q-probes study: 2125 cancer reports from 86 institutions
- Each institution reviewed 25 consecutive surgical pathology reports (breast, colon, rectum, and prostate cancer)
- Recorded type and total number of missing required elements (deemed essential by the American College of Surgery) for each report
- Only 68.8% of all surgical pathology cancer reports contained all the required elements
- Institutions in which checklists were routinely used reported all required elements at a higher rate than those that did not use checklists (88% vs. 34%)
- The missing elements common to cancer reports of all tumor types were extent of invasion and status of resection margins

Impact of Standardized Synoptic Pathology Reporting on Physician Satisfaction

- 970 clinicians (pathologists and treating physicians) across 27 hospitals
- 11-item survey to obtain information regarding timeliness, completeness, clarity and usability (5 point scale); open-ended questions also employed
- 51% response rate
- The vast majority of physicians perceive synoptic reports as significantly better than narrative reports for all items (mean scores ranging from 3.84 to 4.77)
- Statistically significant difference in the overall satisfaction scores of oncologists and pathologists (mean 4.52, SD=0.991 vs mean 4.0, SD 1.34)
 - Pathologists reported that the time to produce the reports was more than that of narrative reports (mean 3.51, SD 1.43) (although end users did NOT perceive a difference in the time to obtain the report)
 - Comments revealed technology-related issues as the most frequent factor impacting timeliness of report completion

Synoptic Reports vs. Structured Data

- Not all synoptic reports contain structured data
- Many synoptic reports are simply word processing documents that appear structured to humans
 - They provide visibly structured blocks of free text which is embedded in the pathology report
- Truly **structured data** is entered in many smaller specific text fields rather than a few large ones
 - Every single data element has its own predefined place in the database
 - Every discrete data element is directly linked to its inherent context

Synoptic reports clarify findings for clinicians while structured data clarifies findings for computers

Advantages of Structured Data

- Beyond the benefits of synoptic reporting, truly structured data in the form of discrete data elements allows for
 - Advanced data-querying capabilities
 - Automated analysis
 - Decision support
 - Predefined comment generation or staging
- Required for the future of pathology informatics and computational pathology

Data Quality in Pathology

- Healthcare documentation has two parts
 - Data capture
 - Report generation

Both must be considered in order to have high quality data

Structured data capture is important step towards improving data quality in surgical pathology (computer readable), but, if the report is of poor quality in the human readable format, data is considered poor quality

Clinician (Mis)interpretation of Pathology Reports

"Clinicians are from Mars and Pathologists are from Venus"

- Goal: Compare clinician comprehension with pathologist intent in written pathology reports
- Typical surgical pathology reports relevant to surgeons and covering a wide range of specimen complexity
- Questionnaires based on these cases administered open-book-examination style to surgical attendings physicians and trainees
- Surgeons misunderstood pathology reports 30% of the time
 - Surgical experience reduced but did not eliminate the problem
 - Familiarity with the report format helped reduce misinterpretation

Please answer the following questions concerning(patient's)_ case.	
1) Was carcinoma in situ identified?YesNoNot stated in report	
2) What was the pathologic staging? Invasion ofSubmucosaSuperficial muscleDeep muscleAdjacent tissuesNot stated in report	
3) Was lympho-vascular invasionYesNoNot stated in report identified?	
4) Was the prostate biopsy adequate?YesNoNot stated in report	
5) Was there prostate cancer?YesNoNot stated in report	
6) How confident are you in your answers overall? (mark an X along the line)	
0 2 4 6 8 10	
confident unsure	

What are elements that lead to successful reporting?

Content is complete

Reports are formatted well...

Design of the Pathology Report

It's not just about the content....

- Used principles from the publishing, commercial aviation and cognitive psychology literature to provide guidance to pathologists interested in formatting diagnostic reports to optimize information transfer
- Four principles are described that can help more effectively communicate information
 - Use headlines to emphasize key findings
 - Maintain layout continuity
 - Optimize information density for readers
 - Reduce clutter

Use Headlines to Emphasize Key Findings

- Lessons from the newspaper industry
- Headline
 - Precedes story
 - Conveys key message in large bold typeface
 - Set off from the body of the story by visual "white space"
 - Often followed by a cascade of progressively smaller subheadings that convey important subpoints (inverted pyramid)



Use Headlines to Emphasize Key Findings

- Traditional specimencentered report
 - Each specimen receives its own diagnosis
- A. PROSTATE, RIGHT BASE: ATROPHY AND CHRONIC INFLAMMATION. NO NEOPLASM IDENTIFIED.
 B. PROSTATE, RIGHT MID: ACUTE AND CHRONIC INFLAMMATION. NO NEOPLASM IDENTIFIED.
 C. PROSTATE, RIGHT APEX: ATROPHY. NO NEOPLASM IDENTIFIED.
 D. PROSTATE, LEFT BASE: ADENOCARCINOMA,
- CONVENTIONAL TYPE, GLEASON 3+4=7, SIZE = 7 MM, PERINEURAL INVASION PRESENT. E. PROSTATE, LEFT MID: SINGLE FOCUS OF ADENOCARCINOMA, CONVENTIONAL TYPE, GLEASON 3+3=6,
- F. PROSTATE, LEFT APEX: ATROPHY AND CHRONIC INFLAMMATION. NO NEOPLASM IDENTIFIED.

- Patient-centered diagnosis
 - Newspaper-style diagnostic headline
 - Most important finding is set apart and above the other findings

PROSTATE: ADENOCARCINOMA

Malignant locations: left base, left mid

Benign locations: left apex, right base, right mid, right apex

Gleason score: 3 + 4 = 7

SIZE = 2 MM.

Size: 7 mm (left base); 2 of 6 cores contain carcinoma Histologic type: conventional prostatic adenocarcinoma

Perineural invasion is present

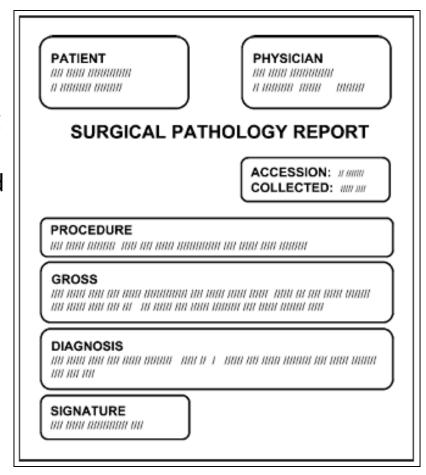
Maintain Layout Continuity

- Experience from the airline industry
 - Uniform positioning of instrumentation eases pilot transition from one type of aircraft to another



Maintain Layout Continuity

- Pathology reports created by a single department usually position fields consistently
- There is less consistency in formatting text within an individual fields and little continuity with reports produced by other departments
- Consistent positioning speeds up information transfer and reduces risk of confusion
- <u>Caveat:</u> Change in report format to an arguably better layout results in a 17% 54% increase in recall errors by clinicians
 - Change creates confusion and should be carefully considered!



Optimize Information Density for Readers

- How much information to include in a single report line
- 4 diagnoses of endometrial carcinoma with different densities of information
 - Progressively less information in the diagnostic headline and more information in the text that follows

ENDOMETRIUM: WELL DIFFERENTIATED ENDOMETRIOID ADENOCARCINOMA (FIGO 1), ARISING IN A BACKGROUND OF ATYPICAL HYPERPLASIA. ENDOCERVIX FREE.

ENDOMETRIUM: ENDOMETRIOID ADENOCARCINOMA (FIGO G1).

Atypical hyperplasia is present. Endocervix not involved.

ENDOMETRIUM: ADENOCARCINOMA.

Histologic type: Endometrioid

Histologic grade: Well differentiated (FIGO 1) Non-malignant endometrium: Atypical hyperplasia

Endocervix: Not involved

ENDOMETRIUM: CANCER.

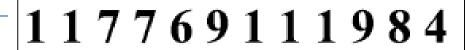
Cancer type: Adenocarcinoma Histologic subtype: Endometrioid

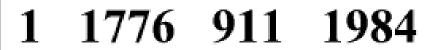
Histologic grade: Well differentiated (FIGO 1) Non-malignant endometrium: Atypical hyperplasia

Endocervix: Not involved

Optimize Information Density for Readers

- Classic example in the psychology literature is inability of an average person to store more than 7 bits of unrelated information in short term memory
- Average person will only be able to recall 7 of the 12 digits
- When digits are grouped into 4 familiar numbers, average person will be able to recall all 12 digits
- When digits are grouped into unfamiliar groups, recall is comparable to ungrouping





117 769 111 984

Reduce Clutter

- Inclusion of distractors in a visual field interferes with the person's ability to acquire information and interferes with short term memory
- **Distractors** include
 - Symbols
 - Text effects (font changes or colors) that draw attention away from the information
 - Unnecessary information
 - Additional information that does not influence patient management or have prognostic value
 - Histologic description (arguable)
 - Billing codes
 - Disclaimers required by regulation

Preserving Formatting Over Electronic Interfaces

- Over 75% of pathology reports for inpatients are first viewed on the hospital information system computer screen (vs. paper)
- Degradation of formatting over interfaces depends on capabilities of the sending and receiving systems and the interface in use
 - HL7 is most commonly used
 - Supports lower and upper case text but not font type, bold, font size, color) or columns and tables

Therefore, reliance on text effects is discouraged where electronic interfaces are likely to be used

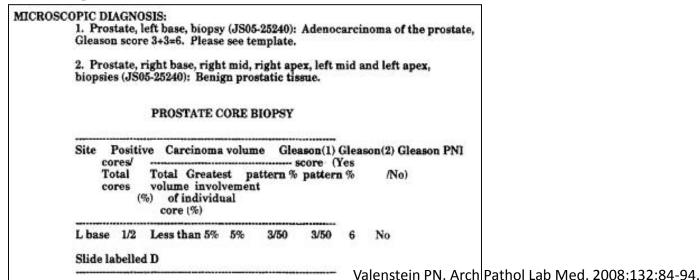
Common formatting problems

Loss of alignment when text created in fixed-width font (Courier) is re-set in proportional font (Arial)

```
Specimen margin: Free of invasive carcinoma by 5 mm
Free of in-situ carcinoma by 1 mm

Specimen margin: Free of invasive carcinoma by 5 mm
Free of in-situ carcinoma by 1 mm
```

Loss of column alignment when tables are constructed



Summary

- Data quality cannot be measured without defining a set of standards. The dimensions of data quality used in other industries can be applied to healthcare.
- Ensuring data quality is more complex in AP due to the traditional narrative or free text nature of pathology reports.
- Natural language processing tools or coding standards can be used to try to improve quality of free text reports and data exchange, however these methods may currently be insufficient for clinical decision support application.
- Initially capturing data a structured synoptic format is the most effective method for ensuring data quality.
- In addition to data content, report formatting is an important aspect of data quality as it relates to communication of data.

Thank you!



How do you code for ambiguous terminology

What about the rest of pathology