



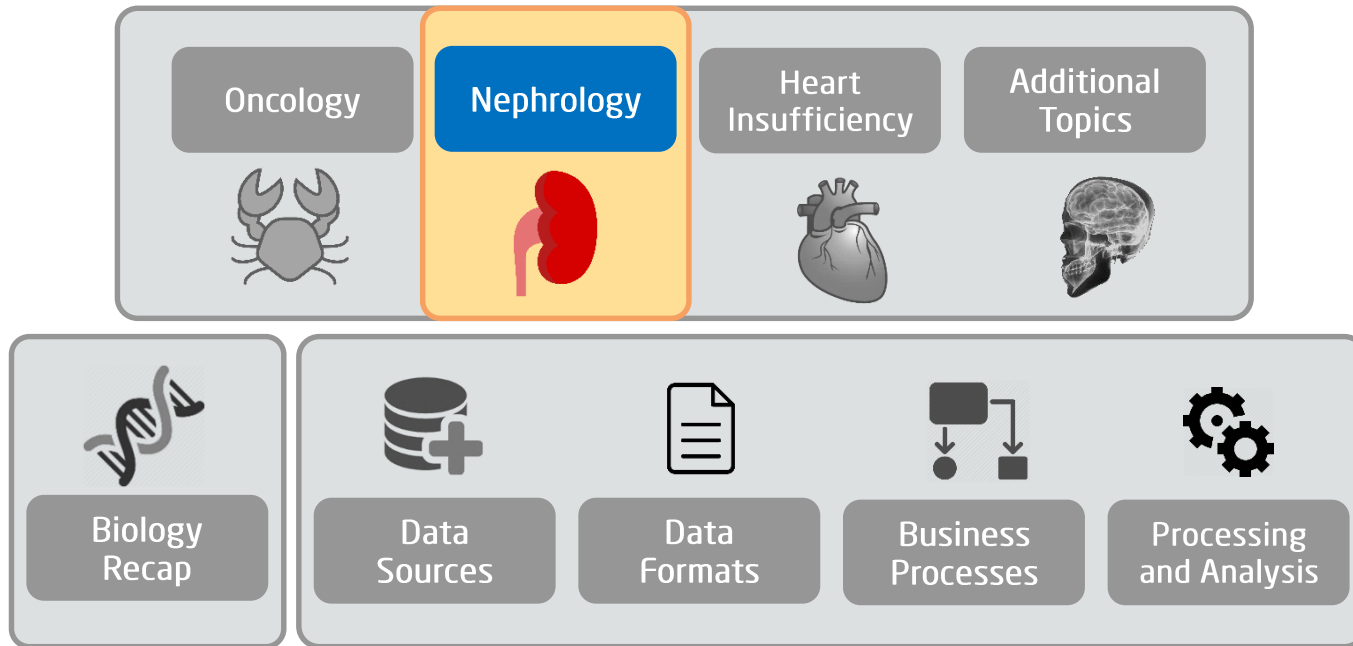
## Evaluation Exercise II

Harry Cruz, Milena Kraus  
Data Management for Digital Health  
Summer 2017

# Exercise II

Data Management  
& Foundations

Real-world  
Use Cases



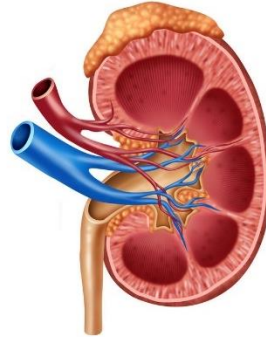
## Walk-through Exercise II

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2

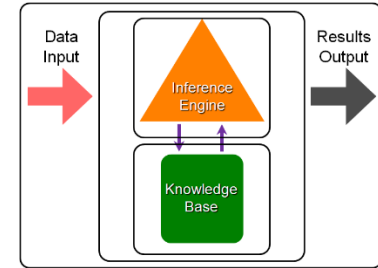
# Exercise II

## Topics

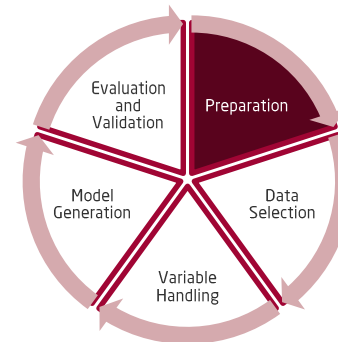
- Nephrology fundamentals
- Clinical Decision Support Systems
- Clinical Data Repository
- Clinical Prediction Models
- Building a CPM with RapidMiner



[https://edc2.healthtap.com/ht-staging/user\\_answer/reference\\_image/3694/large/Kidney.jpeg](https://edc2.healthtap.com/ht-staging/user_answer/reference_image/3694/large/Kidney.jpeg)



Architecture components of CDSS (Kola, n.d.)



Lee, Y.-H., Bang, H., & Kim, D. J. (2016)

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## Exercise II

### Key Stats

20 Questions  
35 Points

32 Students  
32 Passed

Average score  
28.91 / 83%

Average time  
105min

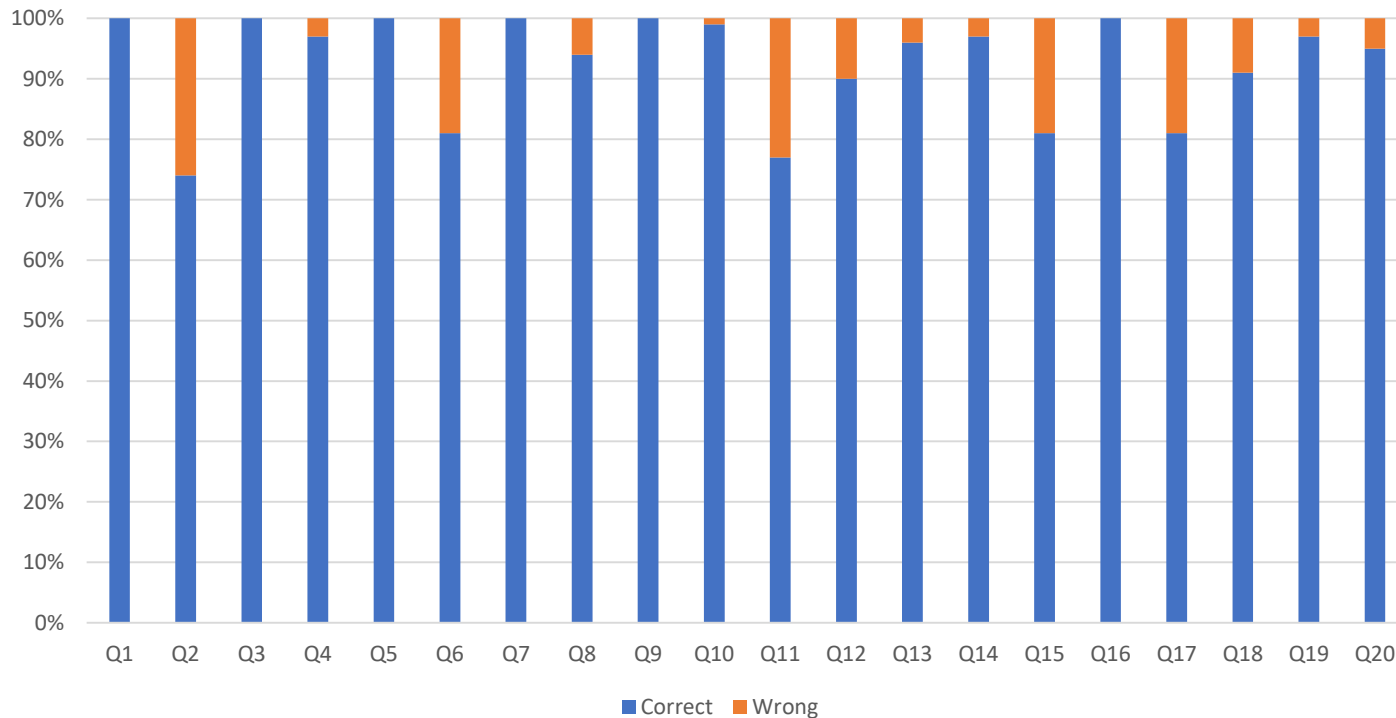


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# Exercise II

## Key Stats



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Q2. What are possible reasons for acute kidney disease at the *renal* level? Please choose all that apply:

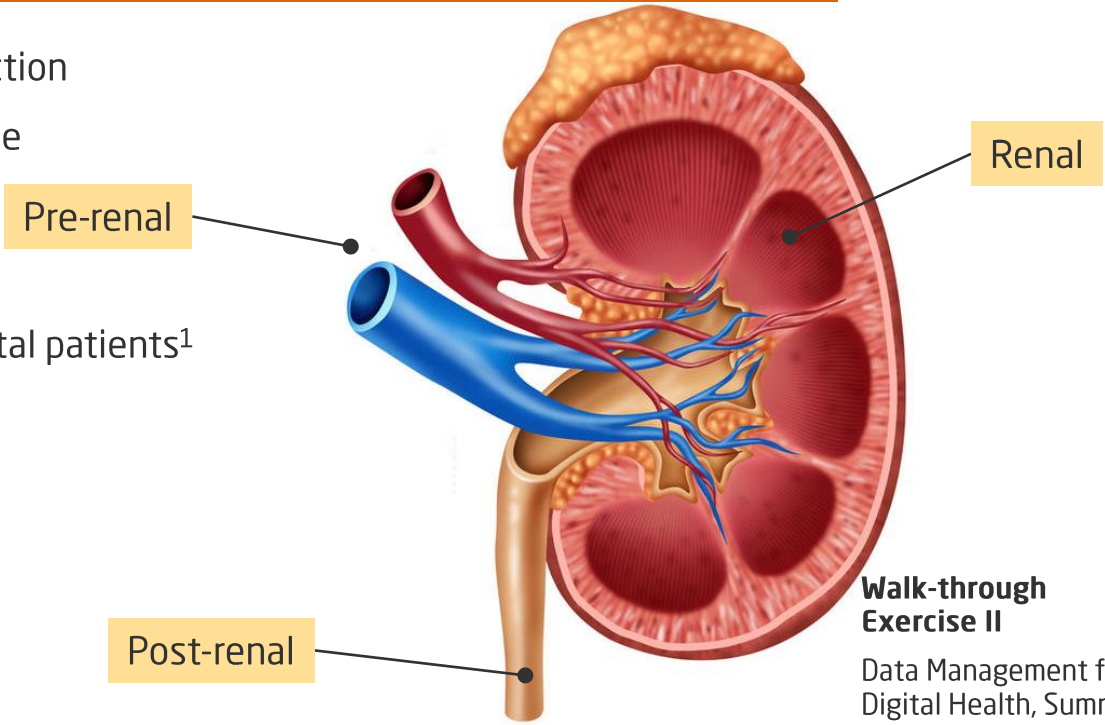
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- Physical damage to the kidneys
- Blockage in the urethra
- Inflammation of the glomeruli, i.e. glomerulitis
- Bladder cancer

# Kidney Disease(s)

## Acute Kidney Injury (AKI)

- Sudden and severe drop of renal function
- Increased levels of urea and creatinine
- May or may not be reversible
- Leads to poor patient outcomes
- Affects between 7 and 18% of hospital patients<sup>1</sup>
- Etiology
  - Pre-renal
  - Renal
  - Post-renal



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7

[https://edc2.healthtap.com/ht-staging/user\\_answer/reference\\_image/3694/large/Kidney.jpeg](https://edc2.healthtap.com/ht-staging/user_answer/reference_image/3694/large/Kidney.jpeg)

## Q6. With respect to a Clinical Data Repository (CDR) and its implementation, please choose all correct alternatives:

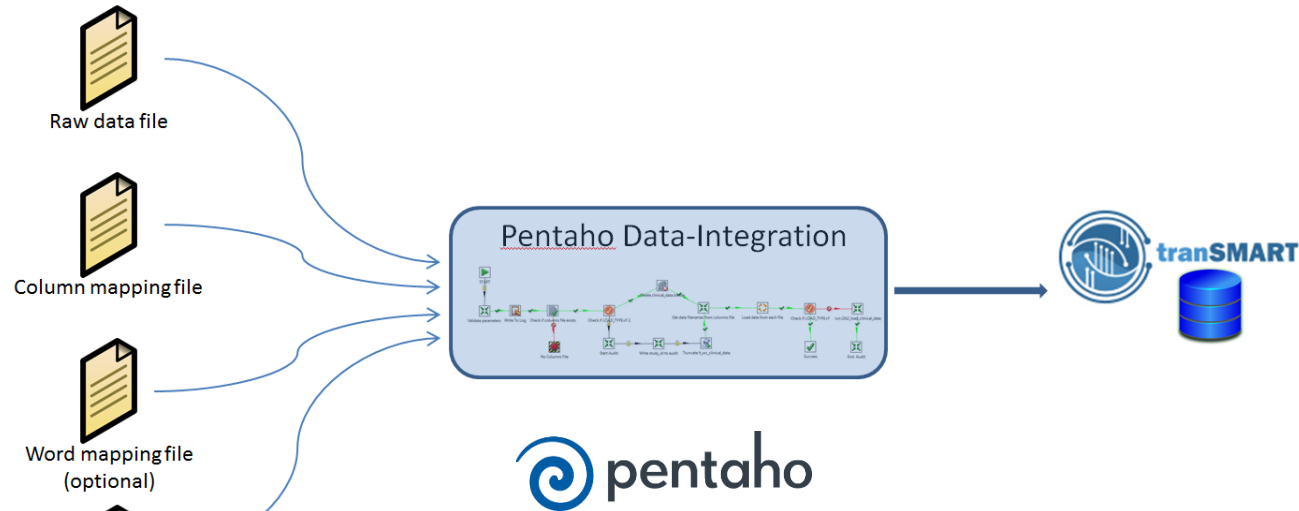
- The integration of heterogeneous data sources into a CDR is often time-consuming, e.g. as it requires the combination and harmonization of different data formats.
- CDRs are planned on top of existing distributed clinical data sources to harmonize data formats and improve data quality.
- Medical researchers usually have clear requirements for CDR that remain stable over time.
- Extract Transform Load (ETL) methods known from business warehouses cannot be used in a clinical context due to privacy regulations.

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8



# ETL can also be used in a medical context



<https://wiki.transmartfoundation.org/display/transmartwiki/5+Clinical+Data>

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# Privacy issues concerning medical data (and others)

- EU General Data Protection Regulation
- Unification of privacy regulations in Europe
- Cross-border health research stands to be facilitated
- GDPR comes into force in mid 2018
- Secondary use of medical data
- Little impact on biomedical data research



EU General Data Protection Regulation

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10

Q11. A critical step in the development of a CPM is its validation. Please choose all alternatives that apply:

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- A ROC curve is an analysis instrument suitable for comparing the performance of different regression models with each other.
- In the absence of external validation data sets, performance can be measured by cross-validation using subsets of the training data.
- A model presenting a ROC AUC = 0.5 is no better than using a random predictor, i.e. dicing.
- A complex model is to be preferred over a simpler model since the former usually presents higher precision than the latter.

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11

## Q15. A new biomarker-based test to diagnose glomerulitis can correctly classify 80% of sick patients...

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- The test presents an accuracy of 0.8 and precision of 0.4.
- The test has a recall of 80% and a precision of 40%.
- The test has a higher specificity than sensitivity.
- Specificity and true negative rate of the test is 70%.

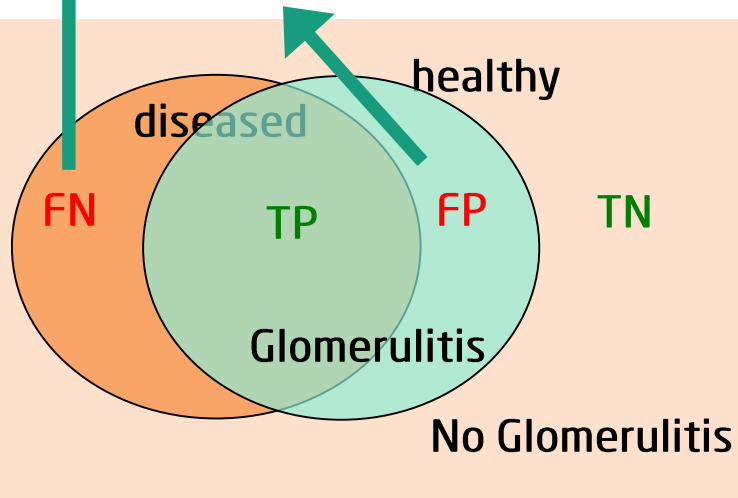
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12

# The Biomarker-based Test for Glomerulitis

recall  
(sensitivity) =  $TP / (TP + FN) = 16 / (16 + 4) = 16 / 20 = 0.8$

precision =  $TP / (TP + FP) = 16 / (16 + 24) = 16 / 40 = 0.4$



Specificity = TNR =  $TN / (TN + FP)$

$TN = 80 \text{ (all negatives)} - 24 \text{ (false positives)} = 56$   
 $= 56 / (56 + 24) = 56 / 80 = 0.7$

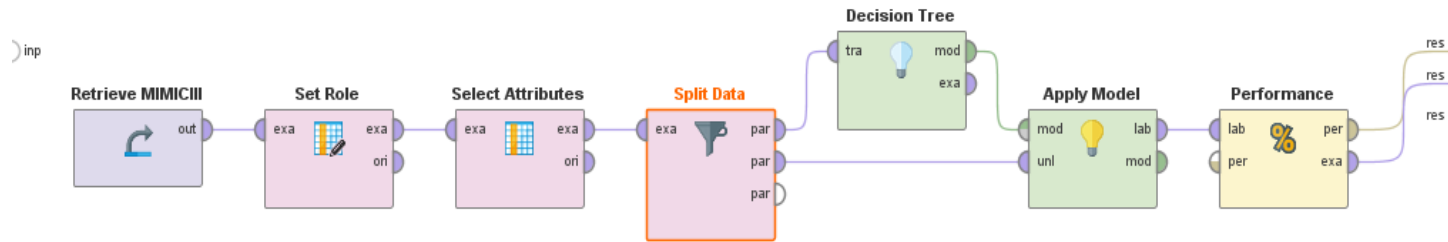
specificity =  $TN / (TN + FP)$

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13

## Q17. Now, we want to examine the performance of the clinical model just created...

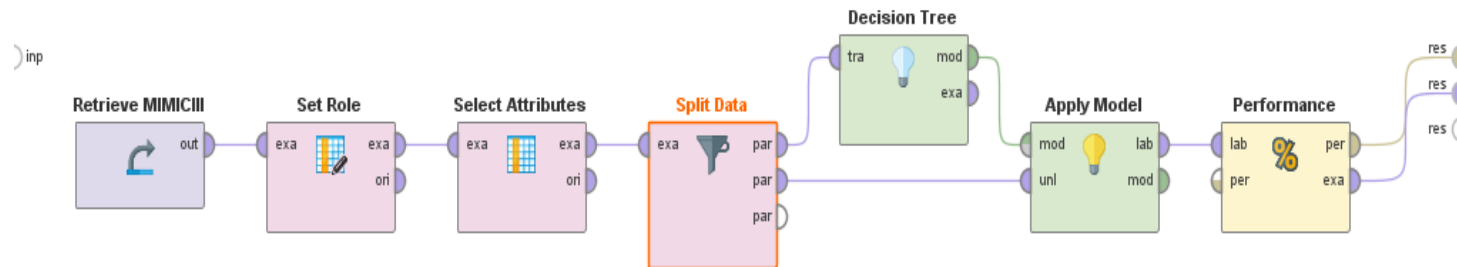
- The model as such performs overwhelmingly better at classifying patients as not having AKI.
- A simple split 50:50 is often not sufficient as validation strategy.
- Accuracy for AKI=no is around 99,99%
- In total, the model classified 100 surgery patients as having AKI



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14

Q17. Now, we want to examine the performance of the clinical model just created...



accuracy: 91.26%

	true no	true yes	class precision
pred. no	5869	531	91.70%
pred. yes	41	100	70.92%
class recall	99.31%	15.85%	

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15