MT4113, Computing in Statistics

Lecture 1 - Hardware, software and algorithms

17 September 2018

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 - Hardware physical computer equipment
 - ► Software set of instructions that operate the hardware ~ computer program

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- Input/Output keyboard, screen, printer, etc.

Computers (from a statistician's persepctive)

Software

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 - ▶ Implementations of programming languages C, S, etc.

Classified according to:

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- Generations: 1st-5th

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 - al is the name of the register and 61h is 61 in hexadecimal, which is 97 in decimal

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 - ► Most programs you use (e.g., Windows, Unix, R, etc.) are written in a 3GL.

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 - Prolog. Used is in artificial intelligence studies.

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- Pros and cons:
 - Interpreted code provides instant feedback good for short, run once jobs. Tend to be used by 4GLs.
 - ► Compiled code runs faster (compiler can *optimize*) good for jobs that will be run many times. Tend to be used by 3GLs.

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 - prototype in a 4GL and then re-write the bits that are slow in a 3GL which you call from the 4GL

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- You are taking MT4113 and we are only teaching you R

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- If you are doing research in statistics, start with R (or maybe MATLAB/Mathematica)

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 - Greater tendency to ignore backwards compatibility?

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Evolution of an R programmer

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- Note: when performing functional programming,
 - there are elements of the R language not previously used that become useful

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 - ▶ Halts in finite time i.e., the algorithm needs to terminate

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