Tuning the Quality System

Cost-Effective (Statistical) Process Control (SPC)

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Teaching Goals

What is the Added Value of internal Quality Control ? What does it do for You ?

Does internal Quality Control bring Attained Quality closer to the Desired Quality ? improve Process Capability ?



Slide 3

Teaching Goals

- understand process control
- understand requirements of standards
- understand the relationship between process control and the value chain under control
- analyze internal quality control (iQC) as a diagnostic process
- understand operational characteristics of iQC pending failure versus unacceptable failure urgency & window of opportunity false/true positive/negative detection rates
- avoid useless counterproductive schemes
- nuts and bolts of iQC (statistical techniques)
- cost-effective method selection

& validation & iQC-deployment



Slide 4

Teaching Goals

We cover in separate modules the diagnostic process uncertainty of measurement This is prerequisite knowledge for this unit on statistical process control

We provide supplemental material with definitions and skills needed to understand this unit **α- and ß-error and power curves**



Operational Definition



Statistical Process Control (SPC) : iQC

SPC / iQC by itself is purposeless. The objective is to keep a target process under control.

"Expectations is the place you must always go to before you get to where you're going. ..."

from The Phantom Tollbooth by Norton Juster



N. Juster



Operational Definition 1/5



Operational Definition 2/5 Intelligent Process Control

- Monitor parameters <u>signifying</u> of the pudding OUTCOMES of the process under control
 - factors key to performance of that process Key technical
- Using statistical techniques
 <u>interpret</u> whether <u>set</u> targets are achieved (appraisal)

- Use that evaluated information

- in a continuous Shewart-Deming-cycle
- to tune / adjust :

the process under control &

- achieve set targets
- reset targets
- analyze & reduce variability

Create Value

the control-process

- operational characteristics
- optimize estimates

- ...

Minimize Burden & Cost

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The proof

Create Value / Minimize Burden & Cost

Quality = Value for your Money = Cost Effectiveness



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Operational Definition 3/5 Appraisal & Prevention = Diagnosis (= Decision)Making

Medical Diagnosis

- by its symptoms
- identify a disease
- to decide about
 - treatment of the patient

Statistical Process Control

- computation based on *observations*, which provide
 - information on the past & current behavior of the system
- algorithms and techniques to determine
 - whether behavior of the system is correct
 - which kind of fault we are facing
 - which part of the system is failing
- decision making
 - to prevent or to remedy failure



Optimize operational characteristics of your diagnostic process

> = 3-part definition identical to medical diagnosis

Operational Definition 4/5

Cost-Effective Investment in OUTCOME CONTROL Shewart-Deming cycle articulates with cost objects

Investment in compliance with the specs





Operational Definition (Summary)

Statistical Process Control (SPC) :

Intelligent system :

 place a value on an objective at which to aim
 measure and keep account of effects of a given action through feedback loops that return a message signifying the suitability of the outcome
 interpret the feedback (conceptualize & build model with requisite variety)

- integrate, decide & act, timely
- learn (from your mistakes)

We translate here the Shewart-Deming cycle into corresponding mental processes. Lack of intelligence is often the weak point in current iQC-practice.



Requirements of the Standards



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Slide 14

ISO-15189:2003

5.6.1 The laboratory shall design internal quality control systems that verify the attainment of the intended quality of results. It is important that the control system provide staff members with clear and easily understood information on which to base technical and medical decisions.

Special attention should be paid to the elimination of mistakes in the **process of handling samples, requests, examinations, reports**, etc.

5.6.2 The laboratory shall **determine the uncertainty** of results, ...

5.6.3 A programme for calibration of measuring systems and **verification of trueness** shall be designed ...

Current iQC-practice
 biased towards end-of-line control / rejection actions



ISO-15189:2003

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Standard focuses on (is biased towards ?) analytical specs

Voice of user / intelligence has to be consequential

Include pre- en post-analytical phases



Defining the Process of Process-Control

Defining " Control "



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Shooting-in a gun : descriptive statistics





imprecise

Marksman : control



first shot



& next shots

CONTROL = learn from the past to affect the future





The Process of Control of the Diagnostic Process

The Broader Panorama (Method Validation) SPC analyzed as a Diagnostic Process



METHOD VALIDATION: PROCESS FLOW CHART

Method Validation Process





CONTROL of the ANALYTICAL PROCESS: FLOW CHART





The Process of Control of the Diagnostic Process

The Broader Panorama (Method Validation) SPC analyzed as a Diagnostic Process



CONTROL of the ANALYTICAL PROCESS: FLOW CHART







Quality Control Patients Chart





A Course in Medical Pathology

- 1. General physiology
- 2. Organ systems
- 3. Pathology & Propedeutics

A Course in Statistical Process Control

- 1. The diagnostic process
- 2. Uncertainty of measurement 🌇
- 3. This unit

DIAGNOSIS

- computation based on *observations*, which provide
 - information on the past & current behavior of the system
- algorithms and techniques to determine
 - whether behavior of the system is correct
 - which kind of fault we are facing
 - which part of the system is failing
- decision making
 - to prevent or to remedy failure

But we treat the patient, not his heartbeat !



Statistical Process Control (SPC) : iQC Flow Chart





Statistical Process Control (iQC)

Requirements of the Diagnostic Process Factors Key to SPC-Performance Concentrating efforts on accurate statistics, disconnected from purposive thinking,

is often the weak spot in iQC-practice

- Relevant

- Accurate

- Timely
- Accessible
- Understandable
- Comparable
- Coherent
- Complete
- Right price/costs

: USER ASKS for a <u>DIAGNOSTIC PROCEDURE</u> to

- detect (pending and nothing but) Relevant Failure
- identify Nature of that Failure
- : sampling design / data processing
- : timing iQC / TAT of evaluation
- : publication of results / conclusions
- : graphical interface / procedures & definitions
- : over methods / levels / time frames
- : bench marking / coherent time frames
- : identification of lacking / censored data
- : high value / low burden to users of procedures

Statistical Process Control

Physiology

1. measurement

2. relevant characteristics

- Pathology
 - 3. errors
 - 4. medically relevant errors
- Propedeutics
 - 5. semeiology
 - 6. diagnostic power
 - 7. sampling / evaluation / reporting



Principles of Cybernetics

- Systems can be treated as machines
- Control = feedback loops
- Your analysis is as good as your model (law of requisite variety = model has to be as complex as is needed, and not more complicated than that)



W. R. Ashby

The Measurement Model



The Measurement Model



Slide 32

The contribution of uncertainty of measurement to the uncertainty of interpretation





Process capability of your analytical process

uncertainty of interpretation uncertainty of measurement





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Relevant characteristics of errors

analytical characteristics Analysis of magnitude uncertainty of measurement random or bias frequency : intermittent or persistent sudden or gradual



Total error concept



However,

- At best, your method is traceable and gives the best estimate for the truth whence $\Delta = 0 \pm$ the epistemic uncertainty
- At worst, bias exists,

but Δ remains unknown, till it is uncovered, and by that fact ends to exist


The bias conundrum





Slide 38

Relevant characteristics of errors

analytical characteristics Analysis of magnitude uncertainty of measurement random or bias frequency : intermittent or persistent sudden or gradual

medical importance

Risk Analysis method validation

critical errors method validation associated adverse effects frequency, urgency of and window for corrections





W.L. Clarke, D. Cox, L.A. Gonder-Frederick, W. Carter, S.L. Pohl Evaluating clinical accuracy of systems for self-monitoring of blood glucose Diabetes care 10:622-28 (1987)



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Semeiology

statistic relevant to process steering or the iQC-test of choice depends on

level of measurement

diagnostic scenario nature of the failure to be detected



Slide 42

Different levels of measurement translate into corresponding models & quality acceptance criteria



Agreed = within the production possibilities frontier, profit from continued counting is offset by costs of lost opportunities



Different levels of measurement translate into corresponding models & quality acceptance criteria

Categorical Report



Categorical classification derived from measurement of a continuous variable Organize iQC at the level of measured numerical variable



Semeiology

statistic relevant to process steering or the iQC-test of choice depends on

level of measurement diagnostic scenario nature of the failure to be detected



Relevant statistics depend on the Clinical Diagnostic Scenario

Diagnostic Scenario's

Screening Case Finding Differential Diagnosis Staging Test Characteristics

Good diagnostic ability = separating power

Low S_{RCF} & Low bias

Good analytical reproducibility



Follow-up

Relevant Statistics depend on the Clinical Diagnostic Scenario



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Process capability of your analytical process

uncertainty of interpretation uncertainty of measurement

The paradox of " the poor diagnostic test " : The poorer the diagnostic ability of a test, the less you have to be concerned about analytical performance. ③

When you cannot improve the situation analytically, shouldn't you select a different test ? 🙁





version 080129 **Relevant Statistics depend on** the Clinical Diagnostic Scenario

Diagnostic Scenario

Is your patient tumor free ?

Is tumor marker level ~ background noise in tumor-free individuals ?





very low level

Relevant Statistics depend on the Clinical Diagnostic Scenario

Diagnostic Scenario's Test Characteristics

 Screening
 Good diagnostic ability

 Case Finding
 = separating power

 Differential Diagnosis
 Low S_{RCF} & Low bias

 Staging
 Low S_{RCF} & Low bias

 Follow-up
 Good analytical reproducibility

 These are the clinical scenario's
 where Control of the Analytical Process is most relevant

 Main issue: Commutability in time and across the walls of the lab and institutions



Semeiology

statistic relevant to process steering or the iQC-test of choice depends on

level of measurement diagnostic scenario nature of the failure to be detected



Relevant Statistics depend on Analytical Characteristics of Errors

analytical characteristics statistical tools

Random Error	Replication
Systematic Error	Difference with target value
Drifts	e.g. Cusum (V-mask)
Periodicity	Time-series analysis
	e.g. Fourier

Statistics : objective criteria & suited for automation : unavoidably, have limited power



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Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure

attainable quality

desired quality

→We are talking about Process Control

operational characteristics of statistical test



Relevant characteristics of errors

analytical characteristics Analysis of magnitude uncertainty of measurement random or bias frequency : intermittent or persistent sudden or gradual

medical importance

🗕 Risk Analysis 😼

critical errors associated adverse effects frequency, urgency of and window for corrections

manageable

→ Design of Control Procedure

unavoidable (aleatory) or avoidable (systematic) certainty with respect to min & max error frontier analytical window of opportunity for corrections



Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure attainable quality desired quality operational characteristics of statistical test







Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure attainable quality desired quality operational characteristics of statistical test



Attainable quality





Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure attainable quality desired quality operational characteristics of statistical test



The iQC Diagnositic Process compared with common Clinical Diagnostic Scenario's

Diagnostic Intent Scenario's Screening Case Finding Do you know what you need? **Differential Diagnosis** Normal behavior / Pending failure / Staging Unacceptable Quality Failure Follow-up Detection of (ikely changes) Do you know what to expect ?



The iQC Diagnositic Process compared with common Clinical Diagnostic Scenario's

You don't know what you need ?



Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure attainable quality desired quality operational characteristics of a test diagnostic ability of iQC-rules & capability of the analytical process the concept of power curves



Slide 64

iQC Diagnostic Tests

- computation based on *observations*, which provide
 - information on the past & current behavior of the system
- algorithms and techniques to determine
 - whether behavior of the system is correct
 - which kind of fault we are facing
 - which part of the system is failing

wheighing

- is the failure relevant ?

Diagnostic Ability

- minimize miss-classification costs

fdr * cost_{fd} + fnr * cost_{fn}

There is only PROCESS CONTROL

- when a relevant target is secured
- in a timely fashion
- with little capacity loss due to inadequacies of the control process

 The corresponding power curve only delivers a solution if an index condition is defined (H₁-model)



The ideal of worlds : Max error frontier >> Min error frontier



iQC is a diagnostic procedure



The ideal of worlds : Max error frontier >> Min error frontier





Slide 68

The worst of worlds : Max error frontier < Min error frontier





"You'll find, that the only thing you can do easily is be wrong, and that is hardly worth the effort."

from The Phantom Tollbooth by Norton Juster



Diagnostic Power

statistics capable of detection of relevant quality failure

medical relevance manageable failure attainable quality desired quality operational characteristics of a test diagnostic ability of iQC-rules & capability of the analytical process the concept of power curves



The concept of power curves

The first basic problem in any course of statistics : Sampling design :

How big a difference (Δ) between samples can I detect ? What is the required size of the sample ?



The concept of power curves The first basic problem in any course of statistics : Sampling design :

How big a difference (Δ) between samples can I detect ? What is the required size of the sample ?




The worst of worlds : detecting error near the Min error frontier

Cases :

detection of unallowable error < Min error frontier detection of pending error

Solution : n ↑↑↑↑

Frequent (pseudo-)real-time sampling

chemical industry : in-process continuous monitoring airspace industry : fly-by-wire techniques clinical lab : statistics on patient results (e.g. AON) ©

Frequent sampling from the viewpoint of statistical control = the sample size form the viewpoint of process control = urgency & window of opportunity = n / time frame



The worst of worlds : detecting a sporadic error

Solution : n tt ?

Increase sample size to improve power of your test





Statistical Process Control

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Propedeutics

- 5. semeiology
- 6. diagnostic power

7. sampling / evaluation / reporting materials & sampling frequency epistemic estimates

bias detection

reporting & interpretation



Sampling : available materials

Epistemic variables to be estimated	Available materials		
	Patient samples	iQC artificial materials	
e uncertainty of measurement	repeat on same sample	repeats	
Δ bias	average of patients (AOP)	shifts	
S _R , S _D , Prevalence	spectral analysis	_	

Underrated Overrated in current iQC-practice



Sampling materials : pro & contra Materials to select Issues iQC Patient samples materials Accurate \odot AON \pm S_{ref} = constant ⊗ level = f (ref range) relevant levels selectable ☺ \otimes Requires © n / <u>time =</u> large non-titrated validation spectrum = relevant stability ? 🛞 filtering needed ? handling artefacts 😕 continuously produced Timely scarcely sampled \otimes instantaneously available © matrix effects ? 8 Comparable directly © between methods Overrated Underrated in current iQC-practice



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materials & sampling frequency

epistemic estimates

bias detection

reporting & interpretation



ESTIMATES – NUTS and BOLTS (1/3)

Central limit theorema:

the best estimate results from continuous accumulation

Changes in components of the measurement system which can give rise to changes in the results and of which the sign of the change cannot be predicted have to be treated as random error & not as bias. **Recipe: ANOVA**

Test-drive our simulator 🌄



That analysis is your analysis of measurement uncertainty is part and parcel of your method validation and has as purpose to reduce risk by detecting avoidable and curing unwanted fluctuation



ESTIMATES – NUTS and BOLTS

EURACHEM Guidance Doc. No 1 WELAC Guidance Doc No. WGD 2

14.16

Once a catalogue of uncertainties is available, the straightforward combination of the standard deviations is appropriate, applying the general law of error propagation. This is achieved by taking the square root of the sum of squared contributing uncertainty components, all expressed as standard deviations.

What do you need to realize this ?

- automated log of individual events that are source of individual error *e.g.* calibrations, lots of calibrators, lots of reagents, ...
- the above ot the acquisition time as part of the raw data record



"Oh, this won't take a minute. I'm the official Senses Taker, and I must have some information before I can take your senses. ... "

from The Phantom Tollbooth by Norton Juster



ESTIMATES – NUTS and BOLTS (2/3)

The above principles can be automated

All other (non-lean) strategies incur only error & waste

treating random error as bias starts from erroneous premises asks for attention to and action in response to unavoidable variance & thus has to induce (avoidable) error

procedurally scheduled readjustment of target values calls for judgments when nothing has to be decided & therefore can only deliver erroneous decisions



ESTIMATES – NUTS and BOLTS (3/3)

→All statistical estimates have limited power

Statistical estimates are prone to interferences e.g. cumulative average will after a while no longer detect a constant bias e.g. cumulative average may blanket a slow drift e.g. cumulative estimate of variance may blanket a saw-tooth function e.g. rules with increased sample size blanket

sporadic events

Recipe : - multiplex rules - VISUAL INSPECTION OF THE RAW DATA

Is what I always do on audits

The bias conundrum (1/2)

Bias exists in simulations as an experimental variable.

In real life, bias exists in our minds only as a hypothetical. As long as bias remains unknown,

it can persists, and cause havoc.

As soon as it is known,

you (mentally) compensate for it and it stops to exist.



The bias conundrum (2/2)

We know the epistemic variables in our models as constants, in principle known. These variables are estimated with a certain level of confidence = epistemic uncertainty

An example from the chemical industry : the mass per packaged unit varies (= random error) the purity can only be < 1, and thus has a fixed sign (= bias) the amount of reagent per packaged unit varies around an average (= epistemic variable ± random error)



Epistemic uncertainty is a fact of life



"If something is there, you can only see it with your eyes open, but if it isn't there, you can see it just as well with your eyes closed. "

from The Phantom Tollbooth by Norton Juster



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7. sampling / evaluation / reporting

materials & sampling frequency epistemic estimates bias detection reporting & interpretation



Quality Control : e.g. Job Shop Workfloor





Reporting & Interpretation (1/2)

The diagnostic scenario is equivalent to continued monitoring of a patient

We report repeat single estimates for a true (but unknown) quantity^{*}

We use that single estimate (or a combination of tests) to detect and interpret instabilities of the system

* quantity = single measurements or single evaluations of one of the rules implemented



Reporting & Interpretation (2/2)

The last value is weighed at a prediction, stemming from the repeated measurements in the past

We don't know what we want ↔ We know what we don't want ⊗

z-scores (x-X)/S and α-errors are the only format available for direct interpretation

H₀-model

In addition to z-scores likelihood ratio's with respect to an agreed upon undesirable condition can be calculated

H₁-model

Expectations is the place you have to go to before you get to where you are going Norman Juster



Interpretation

The lure of statistics

- objective
- amenable to automation

There are three kinds of lies: lies, damned lies, and statistics Benjamin Disraeli

Thermodynamics or **limited efficiency** of a statistical test : Any statistical test will realize but a fraction (< 1) of a maximum achievable power (sens * spec < 1) statistically significant ≠ absolutely certain

The **futility** of statistics : statistically significant ≠ relevant

How then do we convince ourselves ? Visual inspection and pattern recognition outstrips multiplex & complex rules



THE PROPER FRAME of iQC:

Not in-line post-manufacturing control but a measurement tool part of your System of Primary Prevention

Setup- dominant	Machine- dominant	Operator- dominant	Component- dominant	
	Iter	ns		
Labeling	Pipetting	Adjusting	Formulation	
Worklists	Analysis	Expert	Consumables	
Dispension		judgements		
Typical Control Procedures				
Precontrol First-piece inspection	Maintenance In-line periodic inspection	Acceptance inspection iQC	Vendor Rating Incoming inspection	
Attribute inspectio	n iQC	Operator	Prior-operation	
		scoring	control	
			Acceptance	
After LA Seder	Proactive = Good M	anufacturing Practic	ce inspection	
		F. Vanstapel © - Laborat	ory Medicine - University Hospitals - K.U.Leuven	

Interpretation & Actions

Uncertainty of interpretation

handling artefacts poor operational characteristics Recipe confirmatory repeat test

Staging Action ??? ambiguity ??? H_0 : abnormal behavior of system analysis & prevention predefined undesirable behavior recall & correction unacceptable quality failure Cost-effectiveness Action Tools (:)analysis & prevention tog of reagents & events specific procedures recall & correction



Summary

Take Home Message



Summary (1/6) Why is the doctor mad with his patient?

Case : It is common practice in the area where Dr. X works to hand print-outs of lab results to patients. Mr. Y comes and asks what is wrong with his results for chloride and bicarbonate. The values are slightly outside of the normal range, and more significantly they are flagged on the report.

- Dr X explains that this doesn't mean anything
- He doesn't charge his patient for the results
- He stops requesting chloride and bicarbonate
- This is the fifth patient that day with similar questions: he gets mad.



Summary (2/6) Why is our personnel dissatisfied with iQC?

Case : Dr X is up-to date. He read about the latest test for the diagnosis of a not that uncommon ailment in his patients. He starts requesting the test, and learns from his accumulated experience:

- most positive results, upon work-up, turn out to be negative
- positive cases go anyhow undetected
 - = Rock-bottom ROC-curves
- He persists
- He persists, but switches lab
- He gives up, but not without contacting the lab
- This is not his first similar experience, he gives up



Summary (3/6)

Nature of the error

- Transient
- Persistent
- Bias
- Random error

Clinical Requirement

- Analytical sensitivity
- Dynamic Range
- Bias

Practical issue

- Poor Operational Characteristics
- Uncertainty of interpretation

Issue : Limit yourself to what is doable

- poor operational characteristics
- best operational characteristics
- dependent on estimate of true value
- requires multiple measurements

Recipe : Limit yourself to what is relevant

- iQC low level
- iQC low & high levels
- AOP

Recipe

- adjust size / frequency of sample - VISUAL INSPECTION

If you want the system to work empower your technicians & communicate



version 080129

Slide 98

Summary (4/6)



Cost-effective strategies depend on knowing what you want = relevance



Summary (5/6)

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The concept of " relevance " :
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The poorer the diagnostic ability of a test, the less you have to bother about analytical performance. Or, a poor diagnostic test cannot be improved by being particular about analytical performance. ©

The better the diagnostic ability of test, the less analytical performance matters. Or, a good diagnostic test, is insensitive to analytical performance. ©

Not to understand " relevance " is to incur the costs of missed opportunities



Summary (6/6)

The concept of " control " : PROCESS CONTROL = PROCESS <u>CARE</u>

NOT ⁽²⁾ confirmation of past performance

NOT ⁽²⁾ to introduce fluctuations by acting on "chance causes"

NOT secondary prevention by scrap, recall, rework BUT ③ actions to ascertain future proper use

BUT ③ to assign and cure all avoidable fluctuation

BUT © <u>primary prevention</u> by fail-proof design, training & maintenance



From a conversation between the Dodecahedron and young Milo upon his arrival in the land of the Mathemagician:

"But it is very accurate, and as long as the answer is right, who cares if the question is wrong?" "If you want sense, you'll have to make it yourself."

from The Phantom Tollbooth by Norton Juster

