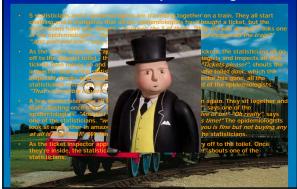


Statisticians vs Epidemiologists



Topics to be covered

Analysis of Correlative Biomarker Studies

- Prognostic Markers
- Predictive Markers
- Statistical differentiation of the two
- Examples**

- extra examples provide

Statistical thinking will one day be as necessary a qualification for efficient citizenship as the ability to read and write.





Anyone who cannot cope with mathematics is not fully human. At best he is a tolerable subhuman, who has learned to wear shoes, bathe, and not make messes in the house.

H.G. Wells

Robert Heinlein

Cancer Treatment and Biomarkers

- Many drugs are found to improve disease free or overall survival for patients with various types of cancer
- However, no regimen is found universally effective for all patients
- The selection of a particular treatment which is best for a given patient is challenging and currently more of an art than a science
- There is a need to find good biomarkers which would be used to "personalize" treatment for cancer patients

Cancer Treatment and Biomarkers

- Many drugs are found to improve disease free or overall survival for patients with various types of cancer
- However, no regimen is found universally effective for all patients
- The selection of a particular treatment which is best for a given patient is challenging and currently more of an art than a science
- There is a need to find good biomarkers which would be used to "personalize" treatment for cancer patients

Types of Tumor Biomarkers

- Prognostic markers
- Predictive markers

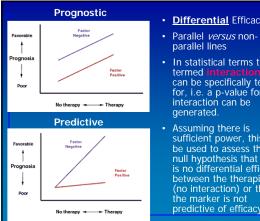
NCIC CTG

Prognostic markers

- The biomarker is called prognostic if it provides information concerning the anticipated natural history of the disease process in a given individual
- ...but where the outcome is independent from therapy
- Answers the question "When?"
- Example: Prostate specific antigen (PSA) in prostate cancer which is used to classify the risk of the patients

Predictive biomarkers

- A predictive marker is a marker that allows the prospective identification of individuals who will or will not benefit from the use of a particular therapy
- Predicts the outcome of a specific therapy
- Answers question "With what?" or "How much?"
- Example: Estrogen receptor in breast cancer which is used to select hormonal treatments for the breast cancer



• **Differential** Efficacy

- In statistical terms this is termed interaction and can be specifically tested for, i.e. a p-value for interaction can be
- Assuming there is sufficient power, this can be used to assess the null hypothesis that there is no differential efficacy between the therapies (no interaction) or that the marker is net the marker is not predictive of efficacy

VOL. 359 NO. 17

Example: KRAS as a Biomarker in Colorectal Cancer

The NEW ENGLAND JOURNAL of MEDICINE

OCTOBER 23, 2008

K-ras Mutations and Benefit from Cetuximab in Advanced Colorectal Cancer

ESTABLISHED IN 1812

Christos S. Karapetis, M.D., Shirin Khambata-Ford, Ph.D., Derek J. Jonker, M.D., Chris J. O'Callaghan, Ph.D., Dongsheng Tu, Ph.D., Niall C. Tebbutt, Ph.D., R.John Simes, M.D., Haji Chalchal, M.D., Jerermy D. Shapiro, M.D., Sonia Robitaille, M.Sc., Timothy J. Price, M.D., Lois Shepherd, M.D.C.M., Heather-Jane Au, M.D., Christiane Langer, M.D., Malcoim J. Moore, M.D., and John R. Zalcberg, M.D., Ph.D.^o

The Influence of K-ras Exon 2 Mutations on Outcomes

In

A Randomized Phase III Trial of Cetuximab + Best Supportive Care (BSC) versus BSC Alone in Patients with Pre-treated Metastatic EGFR-Positive Colorectal Cancer (NCIC CTG C0.17)

National Cancer Institute of Canada Clinical Trials Group

and the

Australasian Gastro-Intestinal Trials Group



S AGITG

Cetuximab: **Multiple Mechanisms of Action**

- IgG1 monoclonal antibody Binds to EGFR and
- competitively inhibits ligand binding (e.g. EGF)
- Blocks receptor dimerization, tyrosine kinase phosphorylation, and signal transduction
- IgG1-induced Antibody-Dependent Cell Cytotoxicity (ADCC)

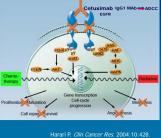
NCIC CTG NCIC GEC

Cunningham D. N Eng J Med 2004 (EMR 007 / BOND)

Lenz H-J.

J Clin Oncol (IMC 0144)

NCIC CTG NCIC GEC



6 AGITG

10.8%

22.9%

12.4%

218

346

1.5 mo

4.1 mo

1.4 mo

S AGITG

Cetuximab: Phase II Clinical Data Efficacy Study Treatment Ν TTP ORR Irinotecan Failure Saltz L. *J Clin Oncol* 2004 (IMC 0141) Cetuximab 8.8% 1.4 mo

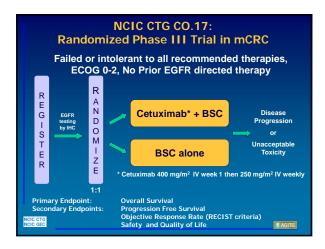
Cetuximab

Cetuximab + Irinotecan

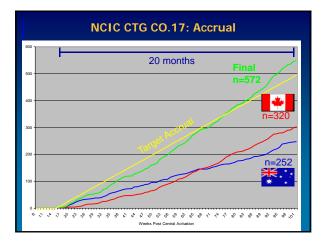
Cetuximab

Irinotecan. Oxaliplatin. Fluoropyrimidine Failure

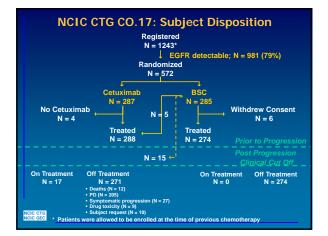




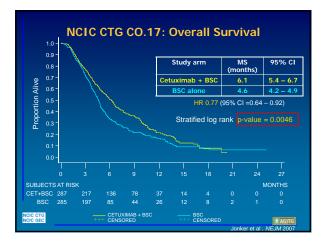




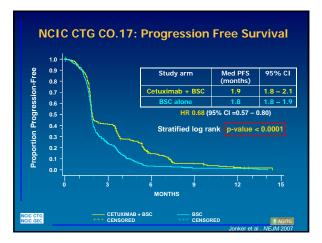














Which patients benefit?

A reliable biomarker is needed:

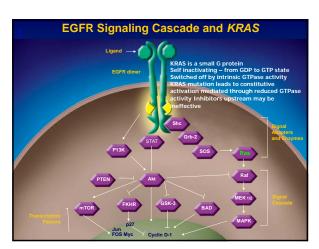
- to provide an accurate prediction of who will respond and benefit from cetuximab
- to improve the therapeutic index
- to improve cost effectiveness of EGFR monoclonal antibody based therapy of pre-treated colorectal cancer

The predictive value of the biomarker would need to be differentiated from its prognostic implications

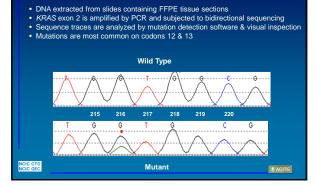
The KRAS mutation status of the bowel cancer may be such a marker of response and a predictor of benefit

S AGITG

```
NCIC CTG
NCIC GEC
```





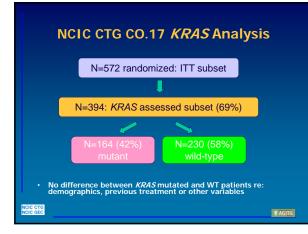


KRAS Mutation Detection



KRAS as a potential predictive marker from single-arm retrospective studies					
Reference	Treatment	Number WT:M	ORR % WT M		
Lievre, A et al J Clin Oncol 2007	Cetuximab +/- CT	89 65:24		0	
Di Fiore, F et al	Cetuximab + CT	59 43:16		0	
Khambata-Ford et al	Cetuximab	80 50:30		0	
De Roock, W et al Ann Oncol 2007 Note cre Note cre	Cetuximab +/- CT	108 66:42	41	O E AGITG	

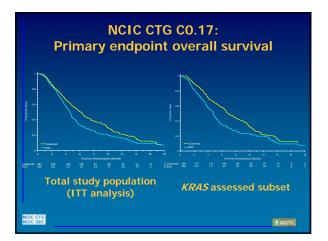




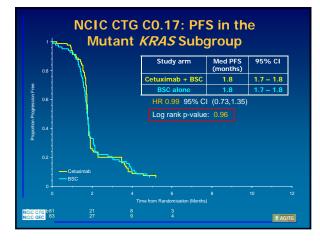


Baseline Characteristic	ITT (N = 572)	Mutated <i>K-ras</i> (N = 164)	Wild-type <i>K-ras</i> (N = 230)	p-value*	
Age – median	63.2	62.0	63.5	0.569	
Gender F	204 (35.7)	63 (38.4)	74 (32.2)		
м	368 (64.3)	101 (61.6)	156 (67.8)		
ECOG PS 0	136 (23.8)	34 (20.7)	56 (24.3)	0.695	
	302 (52.8)	94 (57.3)	127 (55.2)		
2	134 (23.4)	36 (22.0)	47 (20.4)		
Prior XRT	202 (35.3)	50 (30.5)	77 (33.5)	0.531	
Prior chemoRx					
adjuvant	211 (36.9)	57 (34.8)	83 (36.1)		
antiTS	572 (100.0)	164 (100.0)	230 (100.0)		
irinoteca	n 550 (96.2)	161 (98.2)	219 (95.2)		
oxaliplati	n 559 (97.7)	163 (99.4)	222 (96.5)		
Arm CE	۲ 287 (50.2)	81 (49.4)	117 (50.9)	0.772	
BS	C 285 (49.8)	83 (50.6)	113 (49.1)		

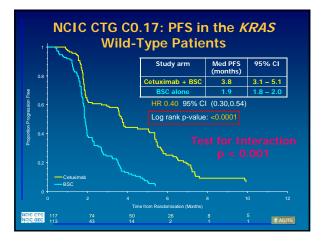




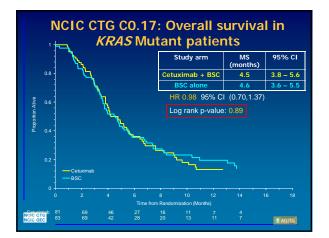




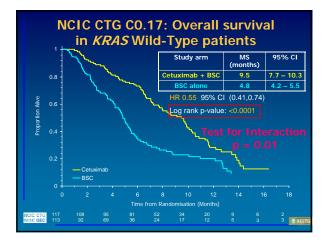




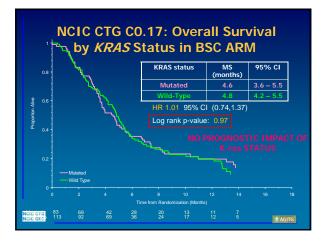














NCIC CTG CO.17: KRAS and Cetuximab Conclusions

In the context of pre-treated advanced colorectal cancer:

- There is no benefit in using cetuximab monotherapy in patients that have mutated *K-ras* tumours
- There is 4.7 month improvement in median survival with cetuximab in patients with *K-ras* wild-type tumours
- The p-value for the interaction between *K-ras* status and treatment is 0.01
- There is an improvement in PFS with cetuximab in *K-ras* wild-type tumours
- *K-ras* mutation status does not have a treatmentindependent prognostic effect

NCIC CTG NCIC GEC

S AGITG

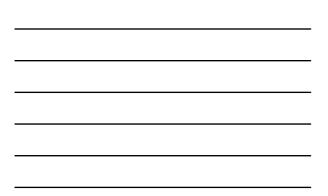
NCIC CTG CO.17: Additional Correlative Studies

Approved

- Epiregulin & Amphiregulin expression ASCO 2009
- BRAF mutations, PIK3CA mutations, Loss of PTEN (IHC, FISH) – in progress
- K-Ras validation pending FDA/BMS
- Proposed
 - FCγR polymorphisms
 - IGF-1R expression

NCIC CTG NCIC GEC





Correlative Study Analyses Examples

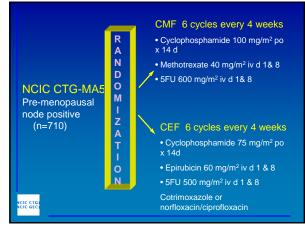
Example: HER2 as a Biomarker for Early Breast Cancer

The NEW ENGLAND JOURNAL of MEDICINE

ESTABLISHED IN 1812 MAY 18, 2006 VOL. 354 NO. 20

HER2 and Responsiveness of Breast Cancer to Adjuvant Chemotherapy

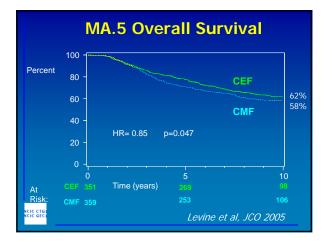
Kathleen I. Pritchard, M.D., Lois E. Shepherd, M.D., Frances P. O'Malley, M.D., Irene L. Andrulis, Ph.D., Dongsheng Tu, Ph.D., Vivien H. Brarnwell, M.B., B.S., and Mark N. Levine, M.D., for the National Cancer Institute of Canada Clinical Trials Group



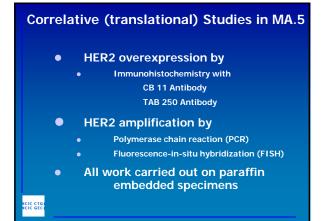
NCIC CTG MA. 5

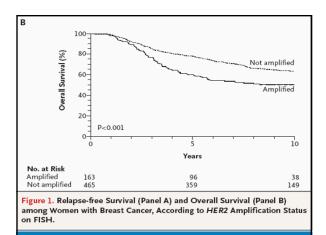
• Patients accrued from 1989 to 1993

- First results published in 1998 which showed that CEF is superior to CMF in both relapse free and overall survivals
- FDA approved CEF for the treatment of early breast cancer in 1999
- CEF became a standard treatment in Canada for premenopausal women with node positive breast cancer
- CEF is however more toxic than CMF (associated with increased risk in heart failure and leukemia) and also more expensive
- There was a need for a biomarker which would be used to identify patients who will benefit from CEF

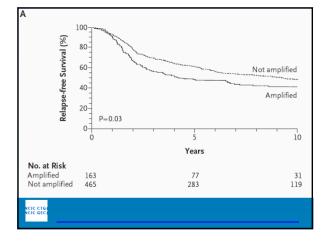




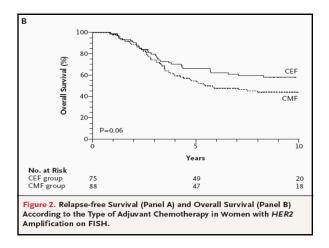




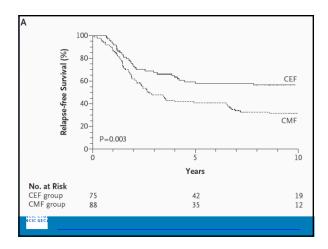




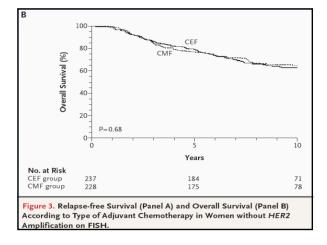




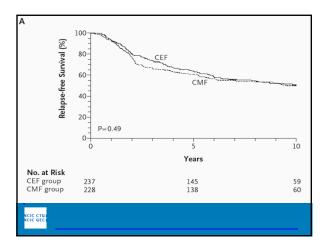














Adjusted*	Hazard Ratios by HER	2 Status (CEF vs. CMF)
	Relapse Free Survival	Overall Survival

p-value

0.49

HR

0.65

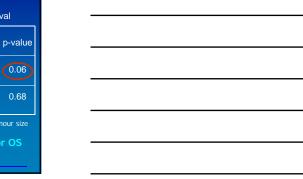
95% CI

0.42 - 1.02

95% CI

0.34 - 0.80

0.52



Conclusions from MA.5 Correlative Analyses

- HER2 amplification or overexpression in breast cancer is associated with a larger benefit from CEF than CMF
- Patients whose tumours do not amplify or overexpress HER2 receive virtually no benefit from CEF, as compared to CMF
- Patients whose tumours do not exhibit HER2 amplification or overexpression could be treated with less toxic regimen of CMF
- Those with tumours which show amplified or overexpressed HER2 should receive dose-intense anthracycline-containing regiments such as CEF.

ICIC CTO

HER2

Amplified

Not Amplified

Limitations of MA. 5 Results to Clinical Practice (From Editorial by Martine Piccart-Gebhart)

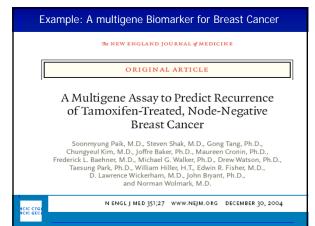
- A benefit of CEF to patients whose tumours do not amplify or overexpress HER2 cannot be firmly ruled out
- It is now known from high-throughput gene-expression profiling of breast cancer that HER2 negative tumour includes at least three different subforms: basal-like; luminal B; luminal A
- Chemotherapy may still be beneficial for HER2 negative patients with luminal B and basal-like breast cancer

NCIC CTO NCIC GEO

The Need for Better Biomarkers

- "It is thought provoking that after 30 years of modern tumour marker research, clinically useful cancer markers are still rare"
- "Gene expression profiling and other highthroughput genomic techniques are likely to find their own niche in the near future"
- Molecular signatures identified from genomics and proteomics studies could prove to be more "accurate" than a single gene biomarker since any particular gene that functions as part of a complex network may contain only limited information about the activity of the entire pathway.

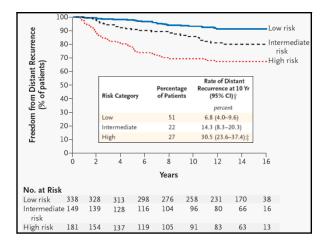
NCIC CTO NCIC GEO



Development of Oncotype DX[™] 21-Gene Assay

- Development of a high-throughput, real-time, RT-PCR method to quantify gene expression with the use of sections of fixed, paraffin-embedded tumor tissue
- Selection of 250 candidate genes from published literature, genomic databases, and experiments based on DNA arrays performed on fresh-frozen tissue
- Analysis of data from three independent clinical trials of breast cancer to test the relationship between expression of the 250 candidate genes and the recurrence of breast cancer
- Selection of a panel of 16 cancer-related genes and 5 reference genes to generate an algorithm to calculate a recurrence score based on levels of expression of these genes

NCIC CTG

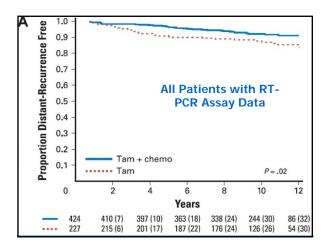




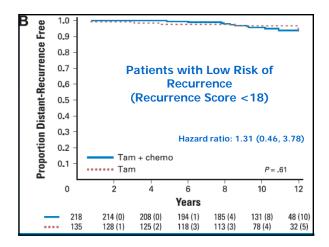
Recurrence Scores and Benefit of Chemotherapy

	Gene Expression and Benefit of Chemotherapy in
	Women With Node-Negative, Estrogen Receptor–Positive Breast Cancer
	Soonmytang Paik, Gong Tang, Serven Slaak, Chungsead Kim, Joffre Baker, Wanscop Kim, Maureen Cronin, Prederick L. Bachner, Drew Wasson, John Bryam, Joseph P. Consannino, Charles E. Goyer Jr, D. Lawrence Wickerlam, and Nermann Wolmark
NCIC CTGI	

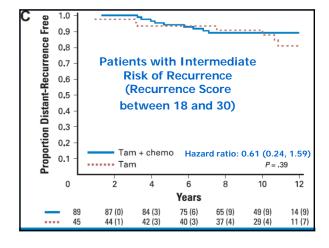












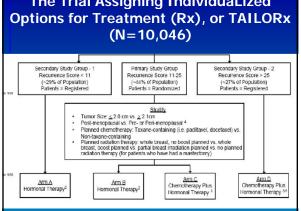


		1.0 -						
Ρ	ee	1.0	~~~~					
	F	0.9 -	15.			_	-	
	Proportion Distant-Recurrence Free	0.8 -	1.1					
	urre	0.7 -	118-14 C					
	Rec	0.6 -	Patients	with I	- Hiah Ri	isk	·····	
	Int-	0.5 -		Recurre				
	ista	0.4 -	(Recurrence Score					
		0.3 -	higher than 30)					
	ortic	0.2 -	т		Ната	rd ratio. (26 (0.1)	2 0 5 2)
	do	0.1 -	Tam + chemo Hazard ratio: 0.26 (0.13, 0.1 Tam P<.001			· ·		
	P		Tar	n			Ρ<.	001
		0	2	4	6	8	10	12
	The p-value of the interaction test between RS and treatment =0.038 Years							
1		11		105 (7)	94 (11)	88 (11)	64 (13)	24 (13)
				34 (12)	29 (16)	26 (17)	19 (18)	11 (18)



Conclusions from RS and Chemotherapy Analysis

- Patients with tumours that had low recurrence score derived minimal, if any, benefit from chemotherapy treatment, while patients with tumours that had high recurrence score experienced a large chemotherapy benefit.
- Patients with tumours that had intermediate recurrence score did not appear to receive a substantial benefit, but the uncertainty in the estimate (relative risk=0.61 with 95% CI from 0.24 to 1.59) cannot exclude a clinically important benefit from chemotherapy treatment
- The Oncotype DX 21 Gene Assay not only quantifies the likelihood of breast cancer recurrence in women with node-negative, estrogen receptor-positive breast cancer (i.e., as a prognostic marker), but also predicts the magnitude of chemotherapy benefit (i.e., as a predictive marker)





The Trial Assigning IndividuaLized