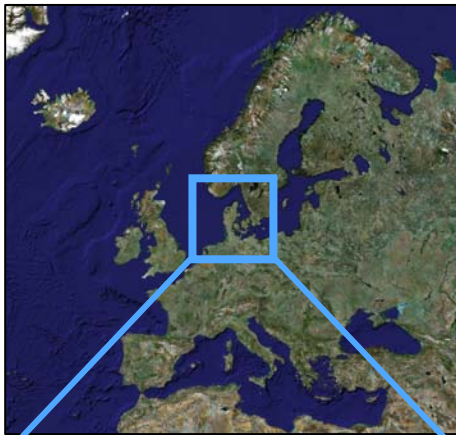


Predicting Individual Radiation Sensitivity:  
Current and Evolving Technologies  
Columbia University Kellogg Center, 2008

## SNPs and late fibrosis

Jan Alsner  
(Molecular biologist)



Department of Experimental Clinical Oncology  
Aarhus University Hospital  
Denmark

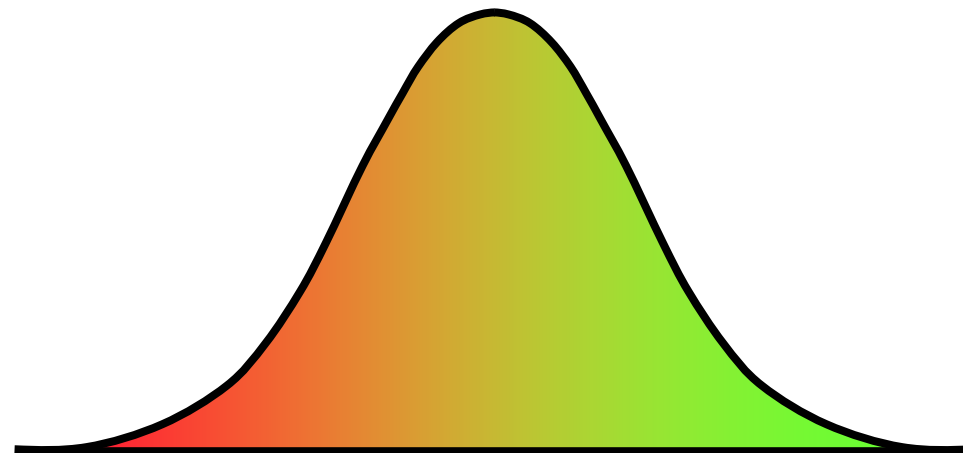


Supported by the Danish Cancer Society



# Variations in risk normal tissue toxicity

Within normal range (not over-reactors)



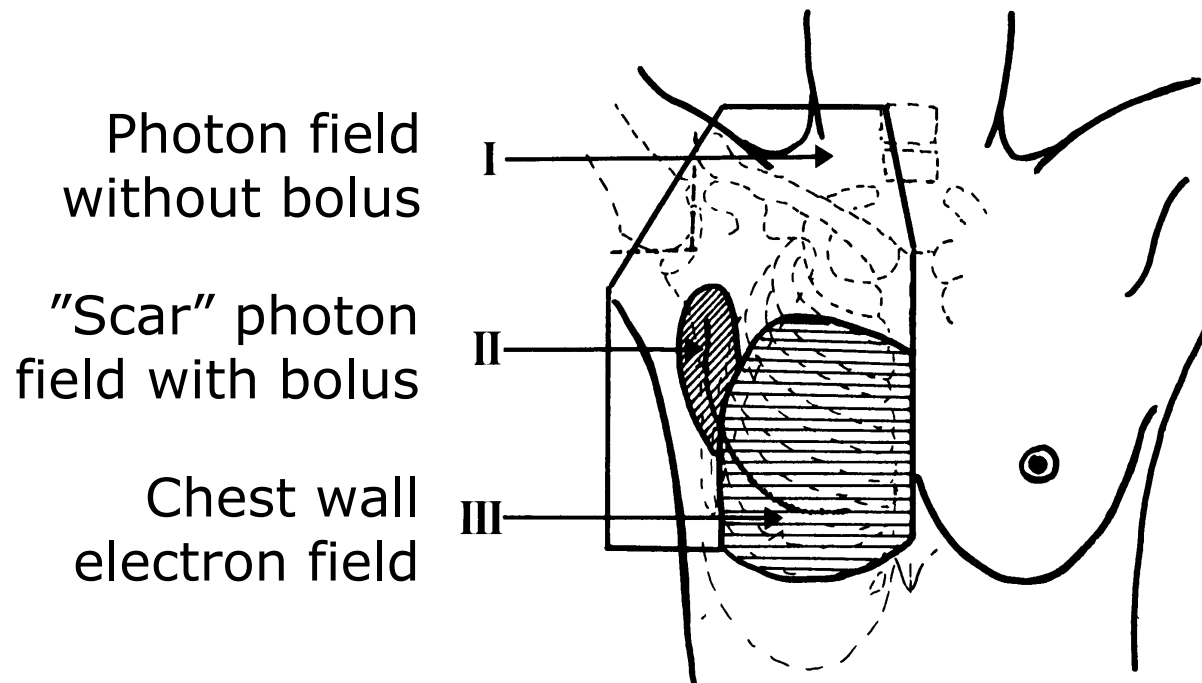
More sensitive

More resistant

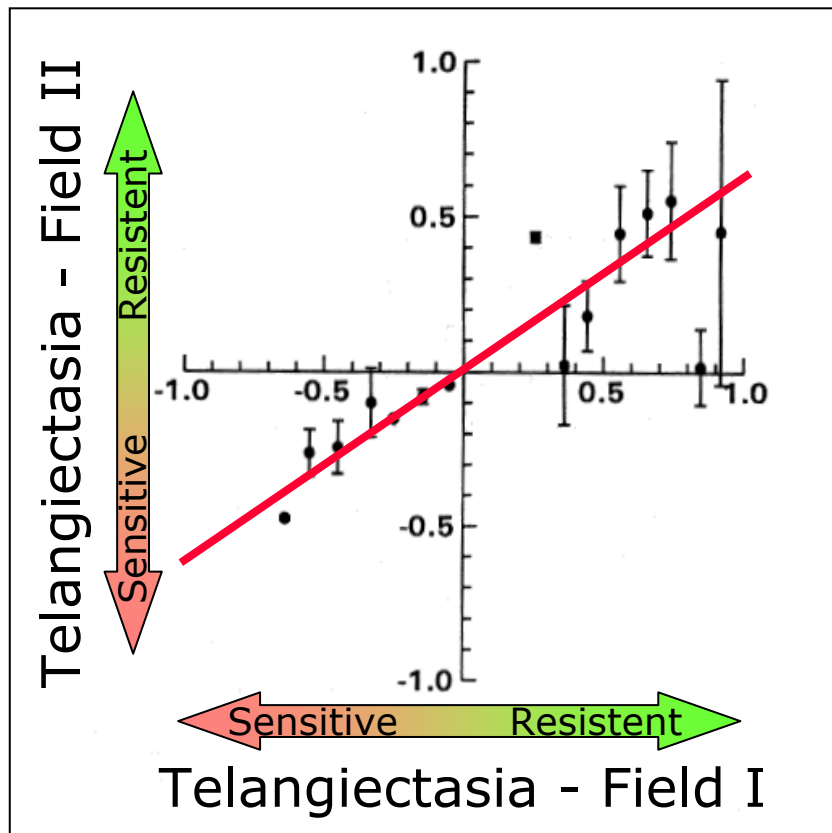


# Background

- Aarhus post-mastectomy cohort
  - 319 patients treated '78-'82
  - Fibroblasts from 41 patients

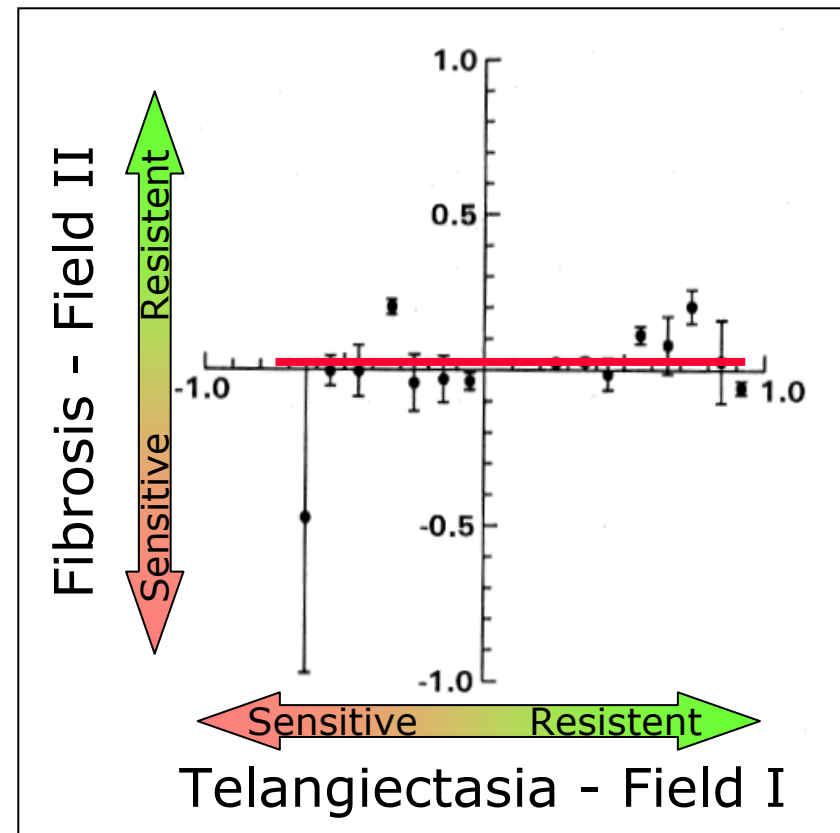


# Intra- and inter-patient variation



Telangiectasia *versus*  
telangiectasia

**Correlation**



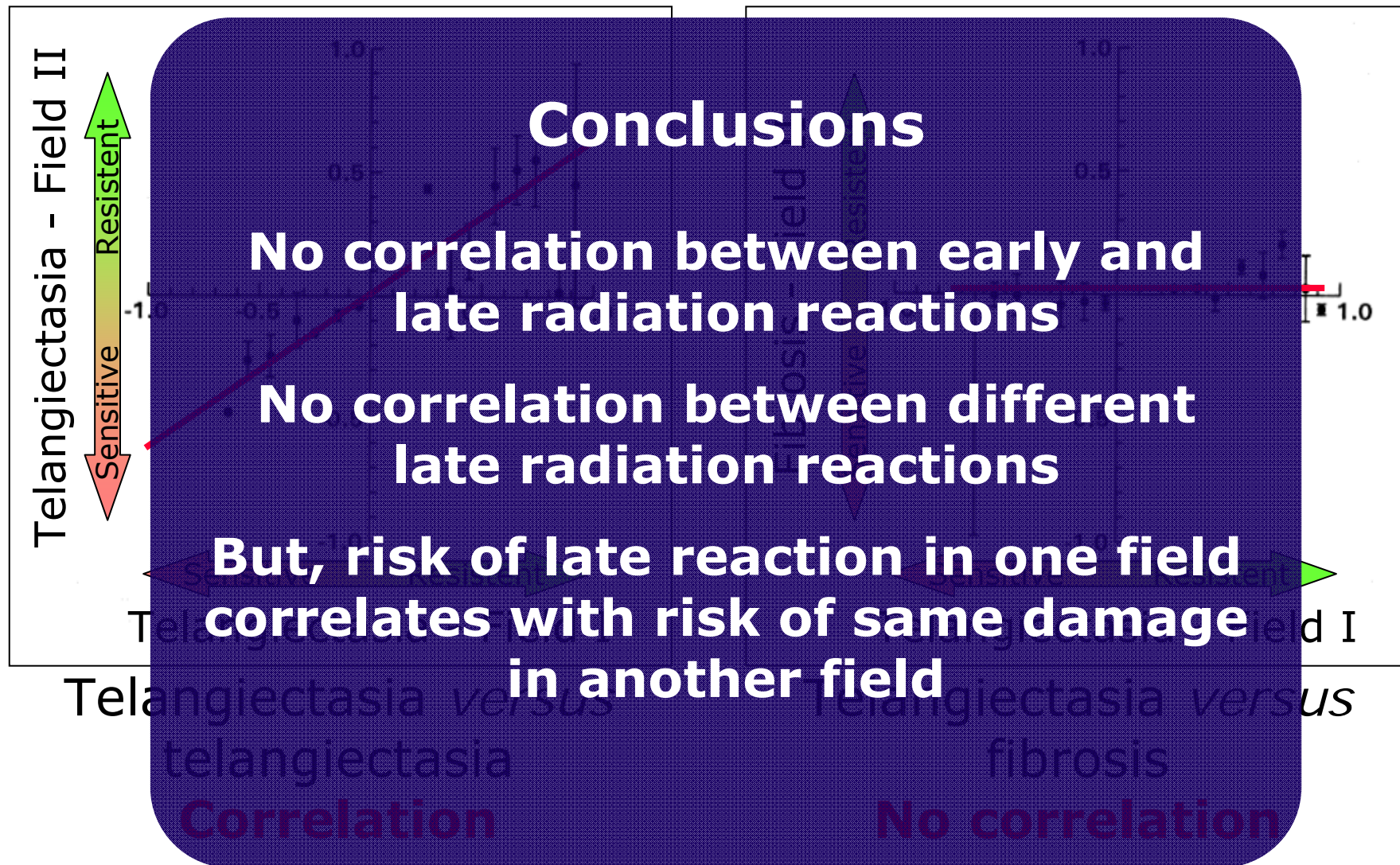
Telangiectasia *versus*  
fibrosis

**No correlation**

Bentzen and Overgaard (1991) Radiother Oncol 20:159-165  
Bentzen and Overgaard's (1993) Eur J Cancer 29A:1373-1376



# Intra- and inter-patient variation

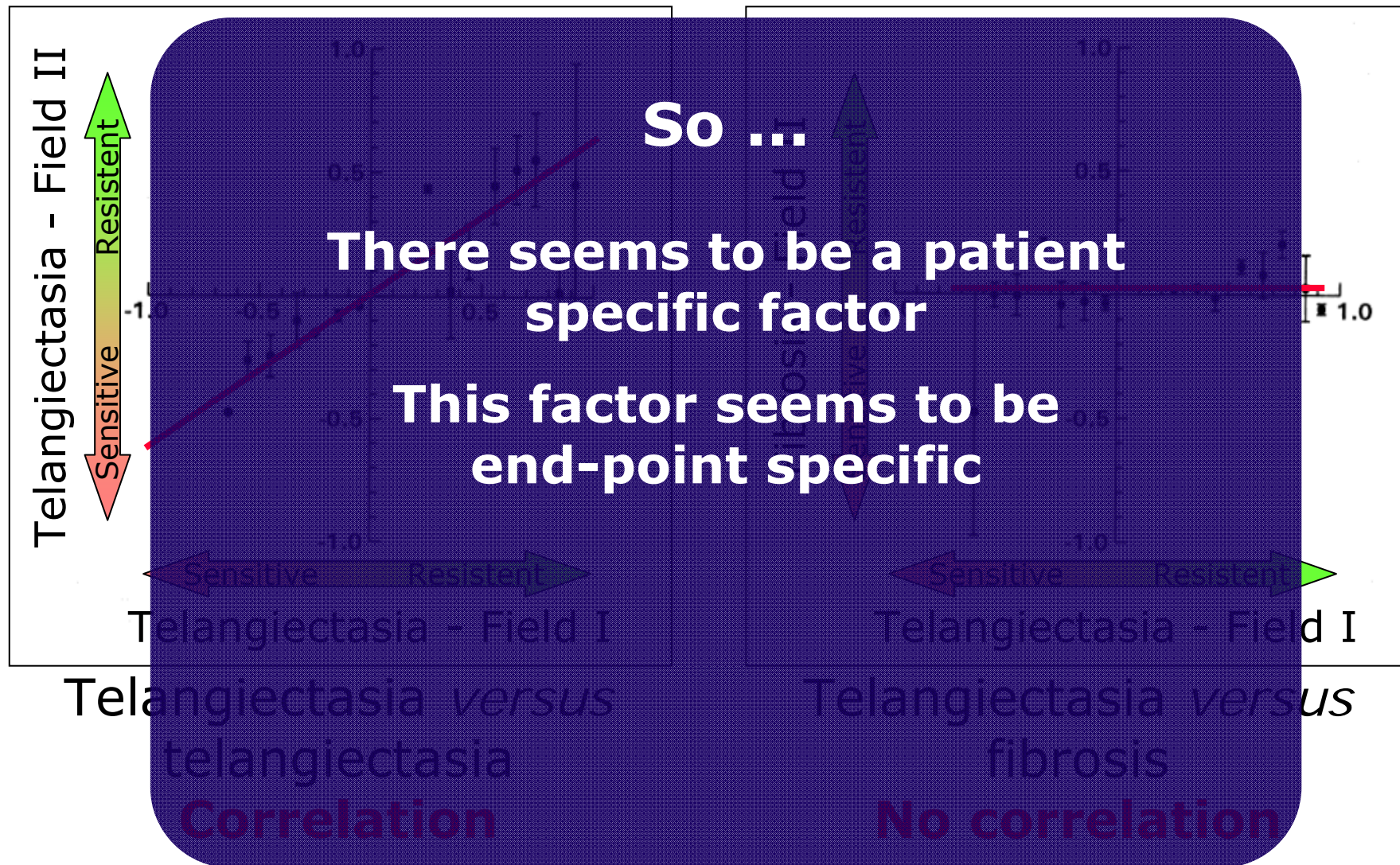


Bentzen and Overgaard (1991) Radiother Oncol 20:159-165  
Bentzen and Overgaard's (1993) Eur J Cancer 29A:1373-1376





# Intra- and inter-patient variation



Bentzen and Overgaard (1991) Radiother Oncol 20:159-165  
Bentzen and Overgaard's (1993) Eur J Cancer 29A:1373-1376



# Predicting normal tissue toxicity



Seminars in  
**RADIATION  
ONCOLOGY**

## **Genetic Markers for Prediction of Normal Tissue Toxicity After Radiotherapy**

Jan Alsner, PhD, Christian Nicolaj Andreassen, MD, PhD, and  
Jens Overgaard, MD, DMSc, FRCR, FACR

Alsner et al. (2008) Seminars in Radiation Oncology 18:126-135  
April 2008 Issue: Prognostic and Predictive Markers in Oncology



# Predicting normal tissue toxicity

- Candidate gene *versus* whole-genome association studies
- Methodological problems
  - Quantitative complex traits and endpoints
  - Clinical *versus* biological phenotypes
  - Tagging SNPs *versus* functional variants
  - Genetic haplotypes
  - Confounding factors
- Intermediate *versus* clinical phenotypes
  - Differential gene expression between patients with either low or high risk of radiation-induced fibrosis in patient-derived fibroblasts after irradiation





# Genetic association studies

First author, year	Gene(s) investigated	N=	Conclusion
Ahn, 2006	<i>CAT, SOD2, MPO, eNOS</i>	446	No significant associations with acute skin toxicity. Association between obesity and skin toxicity possibly modified by <i>MPO</i> and <i>eNOS</i> SNPs
Ambrosone, 2006	<i>GSTA1, GSTP1, GSTM1, GSTT1</i>	446	<i>GSTP1</i> codon 105 Val allele significantly associated with increased risk of acute skin toxicity
Andreassen, 2003	<i>TGFBI, SOD2, XRCC1, XRCC3, APEX</i>	41	Risk of subcutaneous fibrosis significantly associated with the <i>TGFBI</i> position -509 T and codon 10 Pro alleles, <i>SOD2</i> codon 16 Ala and <i>XRCC1</i> codon 399 Arg alleles. <i>XRCC3</i> codon 241 Thr allele associated with risk of subcutaneous fibrosis and telangiectasia
Andreassen, 2005	<i>TGFBI, SOD2, XRCC1, XRCC3, APEX, ATM</i>	52	Risk of altered breast appearance significantly associated with the position -509 T and codon 10 Pro alleles in 26 matched case-control pairs
Andreassen, 2006	<i>ATM</i>	120	Association with the codon 1853 Asp/Asn and Asn/Asn genotypes
Andreassen, 2006	<i>TGFBI, SOD2, XRCC1, XRCC3, APEX, ATM</i>	120	No significant associations between the investigated SNPs and risk of radiation-induced subcutaneous fibrosis
Angele, 2003	<i>ATM</i>	120	Association with the codon 1853 Asn/Asn genotype and risk of various acute and late adverse normal tissue reactions, intronic IVS22-77 CC genotype associated with reduced risk
Appleby, 1997	<i>ATM</i>	23	No <i>ATM</i> mutations detected in 23 patients with severe acute or late toxicity
Borgmann, 2002	<i>ATM, NBS, MRE11, RAD50, DNA ligase IV</i>	5	No mutations detected in five patients with severe late toxicity, possible <i>DNA ligase IV</i> polymorphism detected in one patient
Brem, 2006	<i>XRCC1</i>	247	Haplotype consisting of majority alleles in 4 polymorphic sites associated with increased radiosensitivity (mixed endpoint)
Bremer, 2003	<i>ATM</i>	10	No indications of increased acute or late radio-sensitivity in 10 patients being heterozygous for pathogenic <i>ATM</i> mutations
Cesaretti, 2005	<i>ATM</i>	37	Possession of missense mutations significantly associated with radiation-induced rectal bleeding and erectile dysfunction

List of 40 association studies  
(before summer 2007)



# Whole genome association studies

- Stage design

Vol 447 | 28 June 2007 | doi:10.1038/nature05887

nature

ARTICLES

## Genome-wide association study identifies novel breast cancer susceptibility loci

Douglas F. Easton<sup>1</sup>, Karen A. Pooley<sup>2</sup>, Alison M. Dunning<sup>2</sup>, Paul D. P. Pharoah<sup>2</sup>, Deborah Thompson<sup>1</sup>, Dennis G. Ballinger<sup>3</sup>, Jeffery P. Struwing<sup>4</sup>, Jonathan Morrison<sup>2</sup>, Helen Field<sup>2</sup>, Robert Luben<sup>5</sup>, Nicholas Wareham<sup>5</sup>, Shahana Ahmed<sup>2</sup>, Catherine S. Healey<sup>2</sup>, Richard Bowman<sup>6</sup>, the SEARCH collaborators<sup>2\*</sup>, Kerstin B. Meyer<sup>7</sup>, Christopher A. Haiman<sup>8</sup>, Laurence K. Kolonel<sup>9</sup>, Brian E. Henderson<sup>8</sup>, Loic Le Marchand<sup>9</sup>, Paul Brennan<sup>10</sup>, Suleeporn Sangrajrang<sup>11</sup>, Valerie Gaborieau<sup>10</sup>, Fabrice Odefrey<sup>10</sup>, Chen-Yang Shen<sup>12</sup>, Pei-Ei Wu<sup>12</sup>, Hui-Chun Wang<sup>12</sup>, Diana Eccles<sup>13</sup>, D. Gareth Evans<sup>14</sup>, Julian Peto<sup>15</sup>, Olivia Fletcher<sup>16</sup>, Nichola Johnson<sup>16</sup>, Sheila Seal<sup>17</sup>, Michael R. Stratton<sup>17,18</sup>, Nazneen Rahman<sup>17</sup>, Georgia Chenevix-Trench<sup>19</sup>, Stig E. Bojesen<sup>20</sup>, Børge G. Nordestgaard<sup>20</sup>, Christen K. Axelsson<sup>21</sup>, Montserrat Garcia-Closas<sup>22</sup>, Louise Brinton<sup>22</sup>, Stephen Chanock<sup>23</sup>, Jolanta Lissowska<sup>24</sup>, Beata Peplonska<sup>25</sup>, Heli Nevanlinna<sup>26</sup>, Rainer Fagerholm<sup>26</sup>, Hannaleena Eerola<sup>26,27</sup>, Daehee Kang<sup>28</sup>, Keun-Young Yoo<sup>28,29</sup>, Dong-Young Noh<sup>28</sup>, Sei-Hyun Ahn<sup>30</sup>, David J. Hunter<sup>31,32</sup>, Susan E. Hankinson<sup>32</sup>, David G. Cox<sup>31</sup>, Per Hall<sup>33</sup>, Sara Wedren<sup>33</sup>, Jianjun Liu<sup>34</sup>, Yen-Ling Low<sup>34</sup>, Natalia Bogdanova<sup>35,36</sup>, Peter Schürmann<sup>36</sup>, Thilo Dörk<sup>36</sup>, Rob A. E. M. Tollenaar<sup>37</sup>, Catharina E. Jacobi<sup>38</sup>, Peter Devilee<sup>39</sup>, Jan G. M. Klijn<sup>40</sup>, Alice J. Sigurdson<sup>41</sup>, Michele M. Doody<sup>41</sup>, Bruce H. Alexander<sup>42</sup>, Jinghui Zhang<sup>4</sup>, Angela Cox<sup>43</sup>, Ian W. Brock<sup>43</sup>, Gordon MacPherson<sup>43</sup>, Malcolm W. R. Reed<sup>44</sup>, Fergus J. Couch<sup>45</sup>, Ellen L. Goode<sup>45</sup>, Janet E. Olson<sup>45</sup>, Hanne Meijers-Heijboer<sup>46,47</sup>, Ans van den Ouweland<sup>47</sup>, André Uitterlinden<sup>48</sup>, Fernando Rivadeneira<sup>48</sup>, Roger L. Milne<sup>49</sup>, Gloria Ribas<sup>49</sup>, Anna Gonzalez-Neira<sup>49</sup>, Javier Benitez<sup>49</sup>, John L. Hopper<sup>50</sup>, Margaret McCredie<sup>51</sup>, Melissa Southey<sup>50</sup>, Graham G. Giles<sup>52</sup>, Chris Schroen<sup>53</sup>, Christina Justenhoven<sup>54</sup>, Hiltrud Brauch<sup>54</sup>, Ute Hamann<sup>55</sup>, Yon-Dschun Ko<sup>56</sup>, Amanda B. Spurdle<sup>19</sup>, Jonathan Beesley<sup>19</sup>, Xiaoqing Chen<sup>19</sup>, kConFab<sup>57\*</sup>, AOCs Management Group<sup>19,57\*</sup>, Arto Mannermaa<sup>58,59</sup>, Veli-Matti Kosma<sup>58,59</sup>, Vesa Kataja<sup>58,60</sup>, Jaana Hartikainen<sup>58,59</sup>, Nicholas E. Day<sup>5</sup>, David R. Cox<sup>3</sup> & Bruce A. J. Ponder<sup>2,7</sup>

### Stage 1

>225,000 SNPs  
~400 cases  
~400 controls

### Stage 2

>10,000 SNPs  
~4,000 cases  
~4,000 controls

### Stage 3

30 SNPs  
~22,000 cases  
~22,000 controls



# Whole genome association studies

- Direct design

Vol 447 | 7 June 2007 | doi:10.1038/nature05911

nature

ARTICLES

>500,000 SNPs

---

**Genome-wide association study of 14,000 cases of seven common diseases and 3,000 shared controls**

The Wellcome Trust Case Control Consortium\*



# Quantitative complex traits

- A biological trait that has measurable phenotypic variation
- Genetic basis often involves the effect of several genes
  - Some affect the phenotype in an almost qualitative "all-or-none" way
  - Usually each causal gene only makes a small contribution to overall susceptibility
- Quantitative complex traits are often under environmental influences



# Endpoints

- Most common diseases + risk of radiation-induced morbidity: quantitative complex traits
- Binary phenotypes  
(like disease occurrence "yes or no")
- Complex phenotypes (radiation-induced morbidity)
  - Severity and the time factor (late effects)
  - Clinical *versus* biological phenotypes
  - Confounding factors
  - Genotype-phenotype associations





# Clinical *versus* biological phenotypes

- Presumably, differences exist between the genetic component of various types of radiation-induced morbidity in unselected patients
  - Example: Data from the Aarhus post-mastectomy cohort
- Even if the same overall endpoint is evaluated, clinically defined phenotypes might represent a different underlying molecular pathology
  - Example: alterations in breast appearance after irradiation and late radiation morbidity assessed by palpation of subcutaneous induration might not reflect exactly the same biological mechanisms



# Confounding factors

- Potential confounding factors are differences in
  - radiation dose and type
  - target volume
  - target dose specification (especially when at a variable depth like tumor location)
  - overall treatment time
  - fractionation
  - concomitant chemotherapy
  - juxtaposed skin surfaces
  - immobilizing and dose-modifying device
  - comorbidity (e.g. connective tissue diseases)



# Genotype-phenotype associations

- Understanding the biological function of genotype-phenotype associations
  - Tagging SNPs *versus* functional variants
  - Genetic haplotypes



# Haplotypes

*Carcinogenesis* vol.27 no.12 pp.2469–2474, 2006  
doi:10.1093/carcin/bgl114  
Advance Access publication July 8, 2006

## **The *XRCC1* –77T→C variant: haplotypes, breast cancer risk, response to radiotherapy and the cellular response to DNA damage**

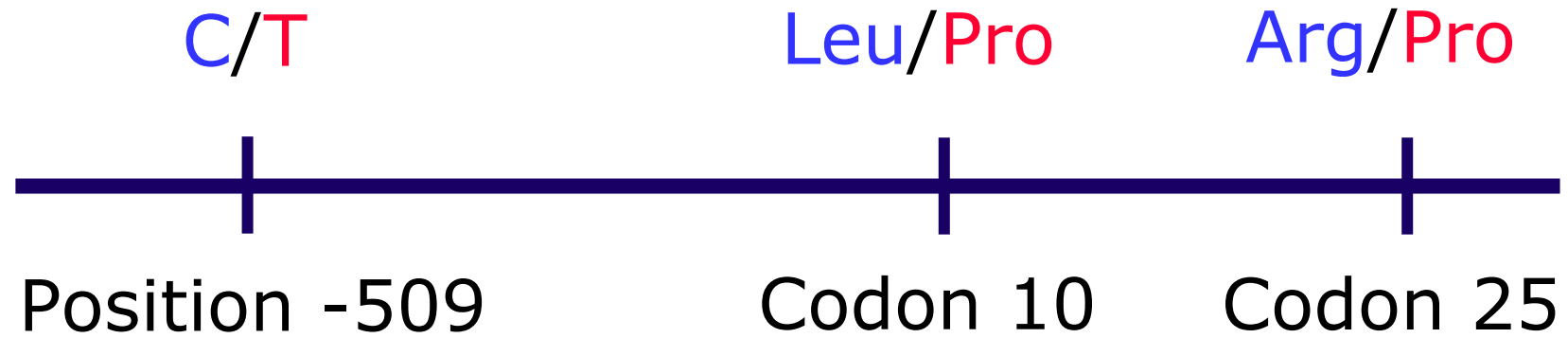
**Reto Brem<sup>1</sup>, David G.Cox<sup>2</sup>, Brigitte Chapot<sup>1</sup>,  
Norman Moullan<sup>1</sup>, Pascale Romestaing<sup>3</sup>,  
Jean-Pierre Gérard<sup>4</sup>, Paola Pisani<sup>1</sup> and Janet Hall<sup>1,5,\*</sup>**

<sup>1</sup>International Agency for Research on Cancer, 150 cours Albert Thomas, 69372 Lyon, France, <sup>2</sup>Department of Epidemiology, Harvard School of Public Health, Boston, MA 02115, USA, <sup>3</sup>Centre Hospitalier Lyon-Sud, Radiothérapie, Curiothérapie, Oncologie, Chemin du Grand-Revoyet, 69496, Pierre Bénite, France and <sup>4</sup>Centre Antoine-Lacassagne, 33 Avenue de Valombrose, 06189 Nice, Cedex 2, France



# Haplotypes

TGF $\beta$ 1 ?





# SNP association studies

NATURE|Vol 447|7 June 2007

nature

FEATURE

## Replicating genotype-phenotype associations

What constitutes replication of a genotype-phenotype association, and how best can it be achieved?

### NCI-NHGRI Working Group on Replication in Association Studies

The study of human genetics has recently undergone a dramatic transition with the completion of both the sequencing of the human genome and the mapping of human haplotypes of the most common form of genetic variation, the single nucleotide polymorphism (SNP)<sup>1-3</sup>. In concert with this rapid expansion of detailed genomic information, cost-effective genotyping technologies have been developed that can assay hundreds of thousands of SNPs simultaneously. Together, these advances have allowed a systematic, even 'agnostic', approach to genome-wide interrogation, thereby relaxing the requirement for strong prior hypotheses.

So far, comprehensive reviews of the published literature, most of which reports work based on the candidate-gene approach, have demonstrated a plethora of questionable genotype-phenotype associations, replication of which has often failed in independent studies<sup>4-7</sup>. As the transition to genome-wide asso-



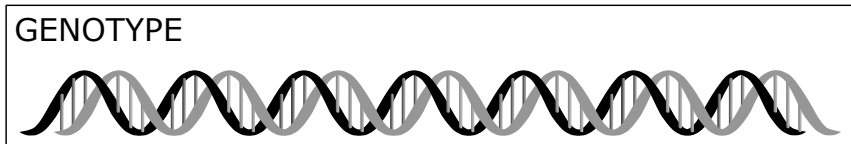
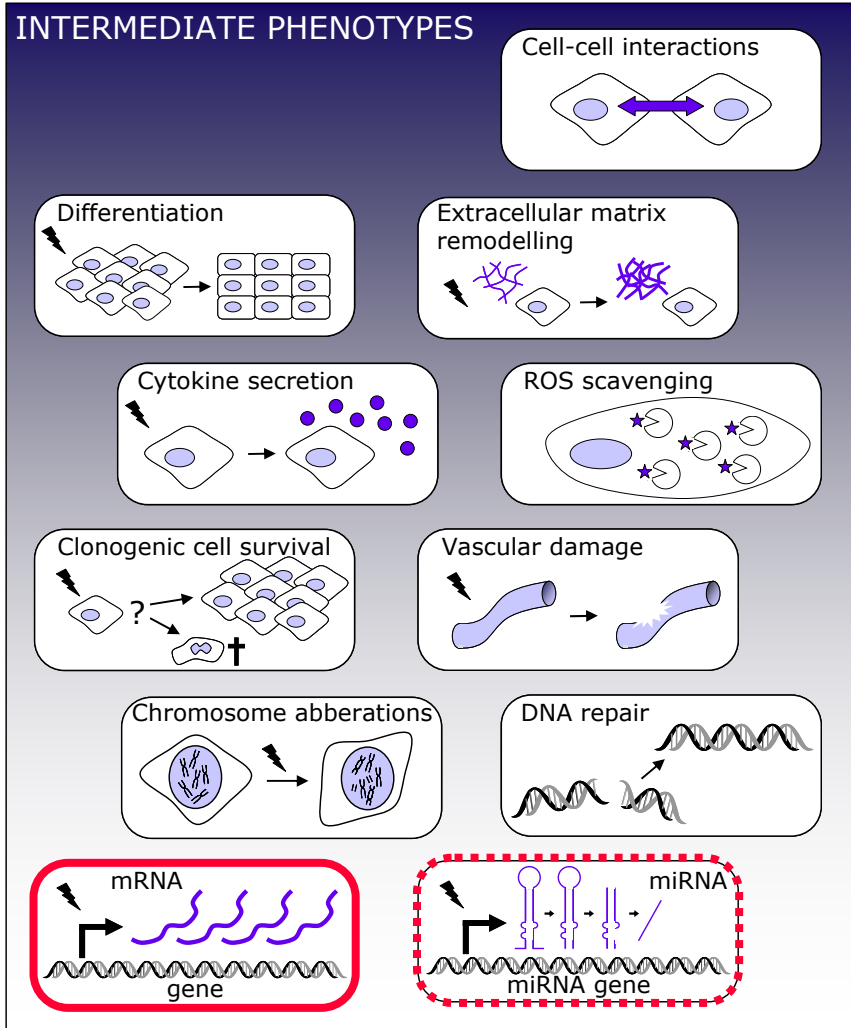
# Endophenotypes (Intermediate)

- The concept of dividing a clinical phenotype (*quantitative complex trait*) into more stable phenotypes which
  - correlate with the clinical phenotype
  - associate more closely with genetic variants
  - may be portrayed by gene/protein expression patterns
  - may be applicable to pathway analysis



# Various normal tissue damage endpoints

## CLINICAL PHENOTYPE

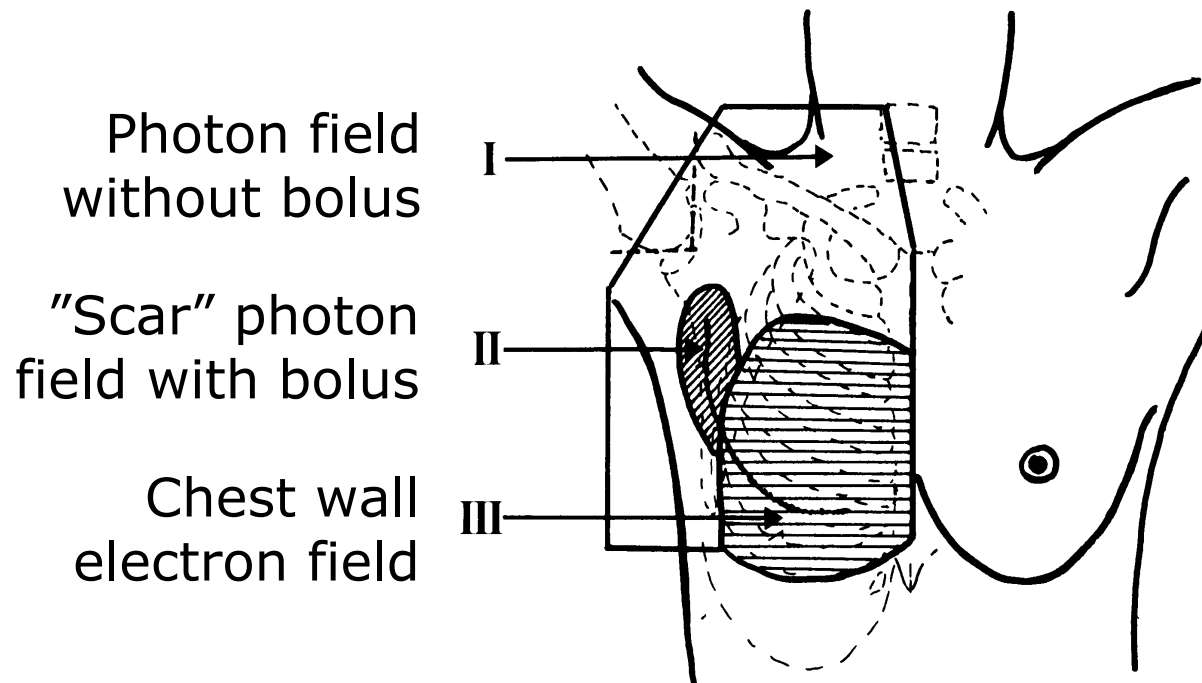


SNPs, CNVs, and other types of sequence variation



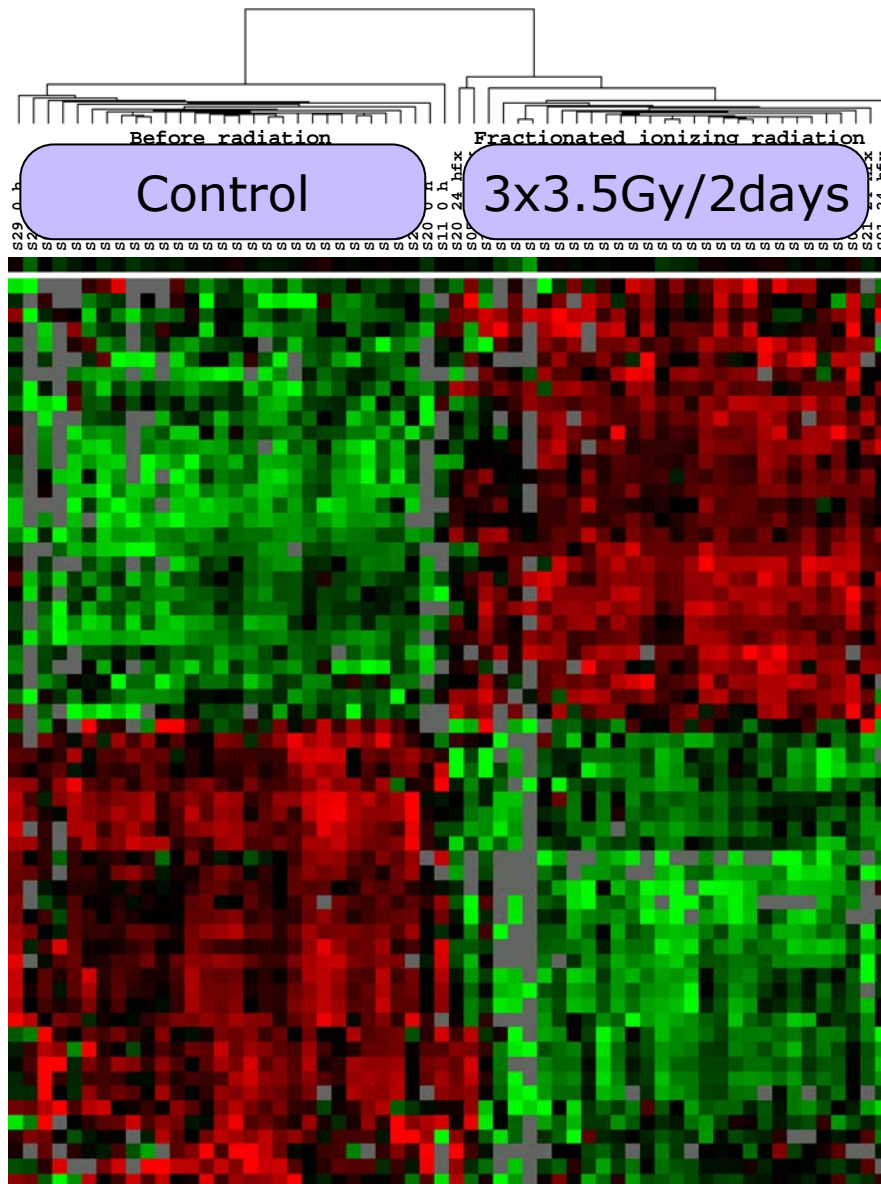
# Irradiated fibroblasts

- Aarhus post-mastectomy cohort
  - 319 patients treated '78-'82
  - Fibroblasts from 41 patients



# Genome-wide approach

Selection of genes  
(total: 225)  
SAM analysis



Up > 2 fold  
by irradiation

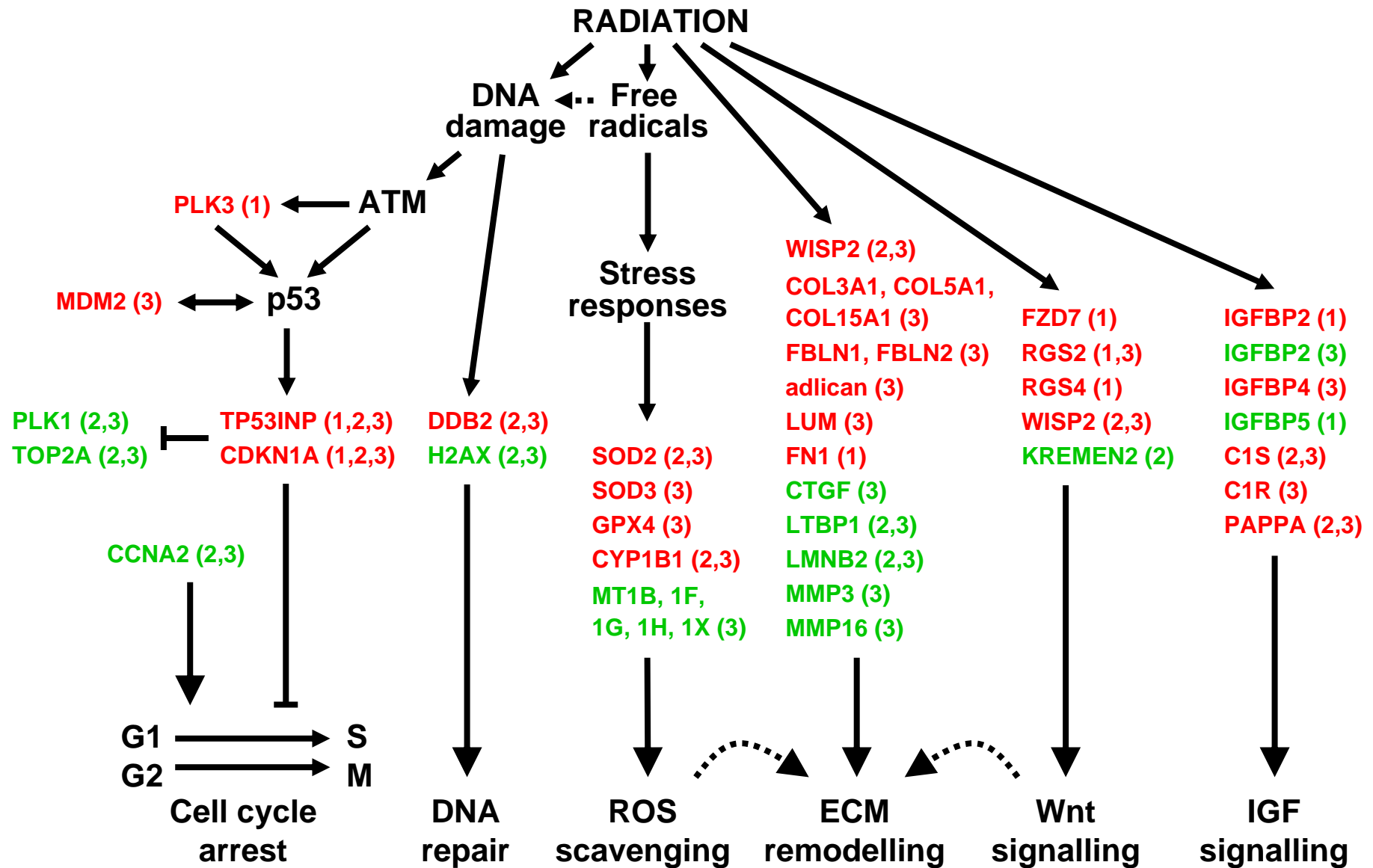
Down > 2 fold  
by irradiation

- heat shock 27kDa protein 2
- collagen, type III, alpha 1
- insulin-like growth factor binding protein 4
- fibulin 1
- fibulin 2
- collagen, type XV, alpha 1
- transforming growth factor, beta receptor III
- cyclin-dependent kinase inhibitor 1A
- DKFZp541l adican
- interleukin 11
- stromelysin 1
- lumican
- complement C1s
- cytochrome P450 1B1
- pregnenolone oxidase
- tumor necrosis factor receptor superfamily, member 18
- tumor necrosis factor receptor superfamily, member 9
- WNT11
- chemokine (C-C motif) receptor 1
- complement C1r
- glutathione peroxidase 4 (phospholipid hydroperoxidase)
- superoxide dismutase 3, extracellular
- damage-specific DNA binding protein 2, 48kDa
- superoxide dismutase 2, mitochondrial
- polo-like kinase 2
- collagen, type V, alpha 1
- Kruppel-like factor 4
- regulator of G-protein signalling
- Murine double minute 2
- matrix metalloproteinase 3
- matrix metalloproteinase 16 (membrane-inserted)
- tubulin, alpha 2
- polymerase (RNA) II (DNA directed) polypeptide G
- topoisomerase (DNA) II alpha 170kDa
- latent transforming growth factor beta binding protein 1
- lamin B2
- H2A histone family, member X
- tubulin, alpha 1
- CDK inhibitor 3
- polo-like kinase 1
- serine protease inhibitor 1
- cyclin D1
- ubiquitin
- ubiquitin
- cytochrome P450 2C19
- thymidylate synthase
- cyclin D2
- MCM4 (S. cerevisiae)
- CDCA2
- SMC4-like 1 (yeast)
- MT1B
- metallothionein IX
- metallothionein 1G
- metallothionein 1F
- metallothionein 1H
- tissue factor pathway inhibitor 2
- connective tissue growth factor
- tumor necrosis factor receptor superfamily, member 12A
- retinoic acid receptor gamma
- integrin, alpha 2
- insulin-like growth factor binding protein 2





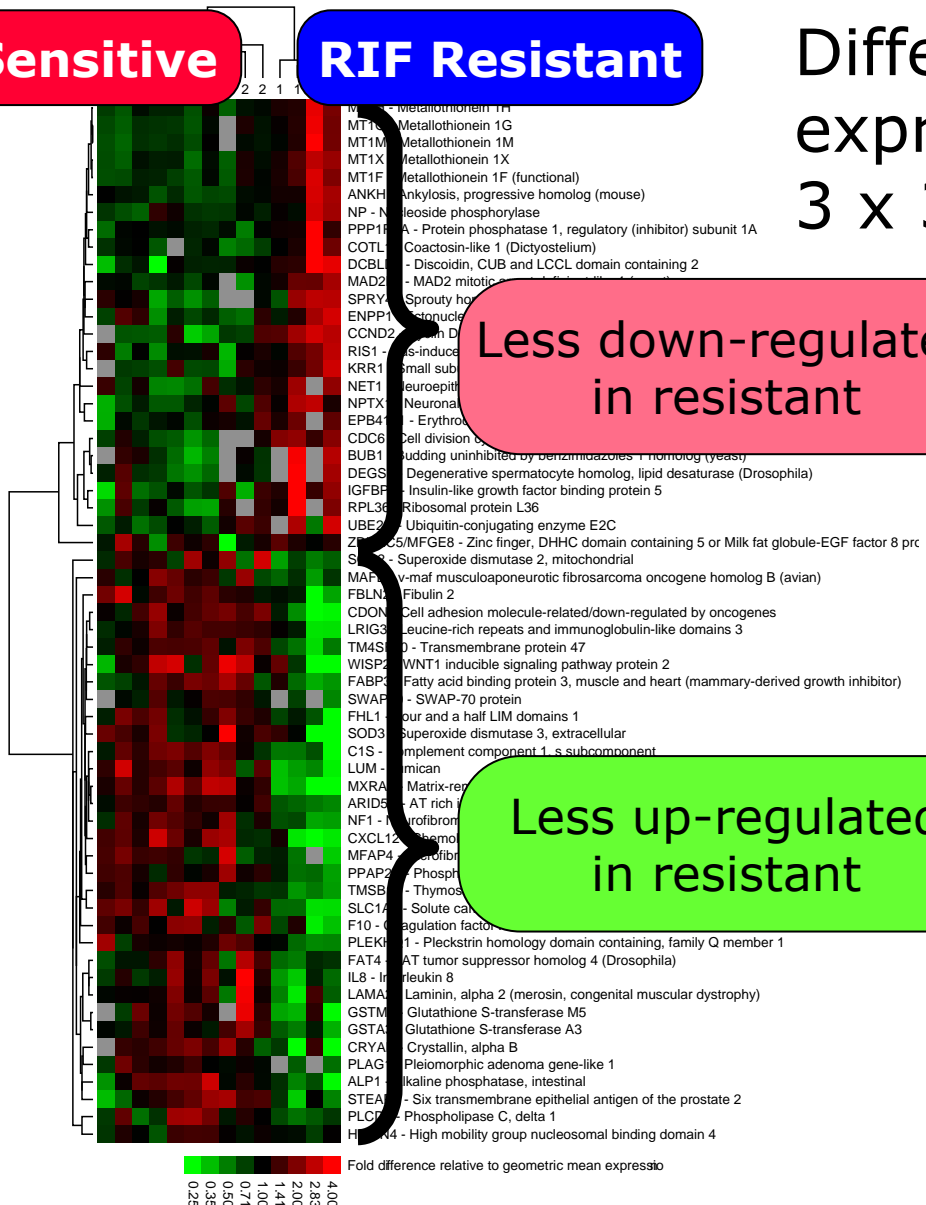
1) 1 x 3.5 Gy; 2 h    2) 1 x 3.5 Gy; 24 h    3) 3 x 3.5 Gy / 2 days; 2 h



# Genome-wide approach

**RIF Sensitive**      **RIF Resistant**

Differentially expressed genes after  
3 x 3.5 Gy / 2 days  
(total: 60)



Less down-regulated  
in resistant

Less up-regulated  
in resistant



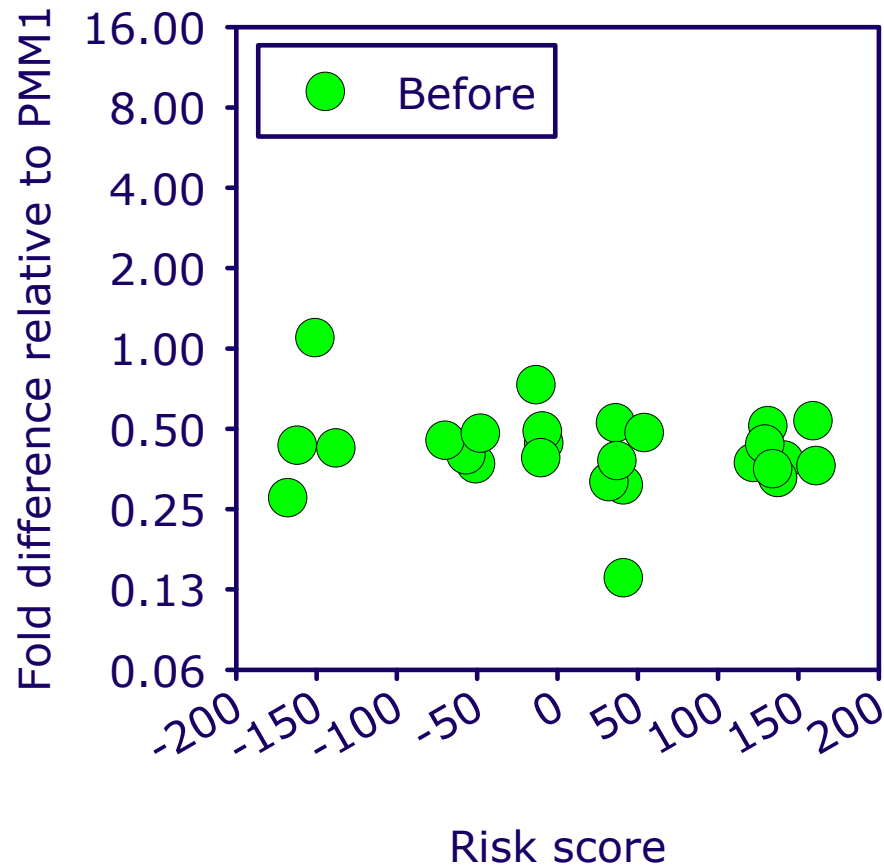
# 'Independent' validation - real-time PCR

- Same and more cell lines (but different batches)
- New irradiation - reference gene: *PMM1*
- Before and after 3 x 3.5 Gy / 2 days



# FAP, Fibroblast activation protein $\alpha$

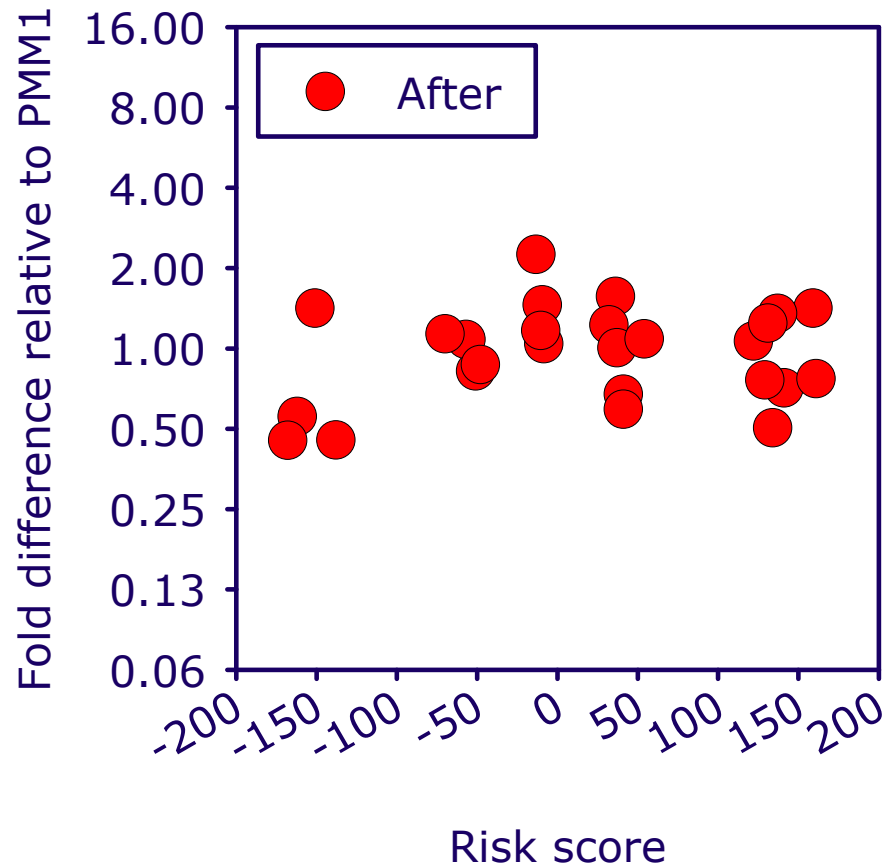
Before and after 3 x 3.5 Gy / 2 days



- Member of the cell surface dipeptidyl peptidase (DPP) family of serine proteases
- Important during embryonic development
- Induction of FAP $\alpha$  expression in fibroblast during wound healing, in fibrotic processes, and in tumour stroma

# FAP, Fibroblast activation protein $\alpha$

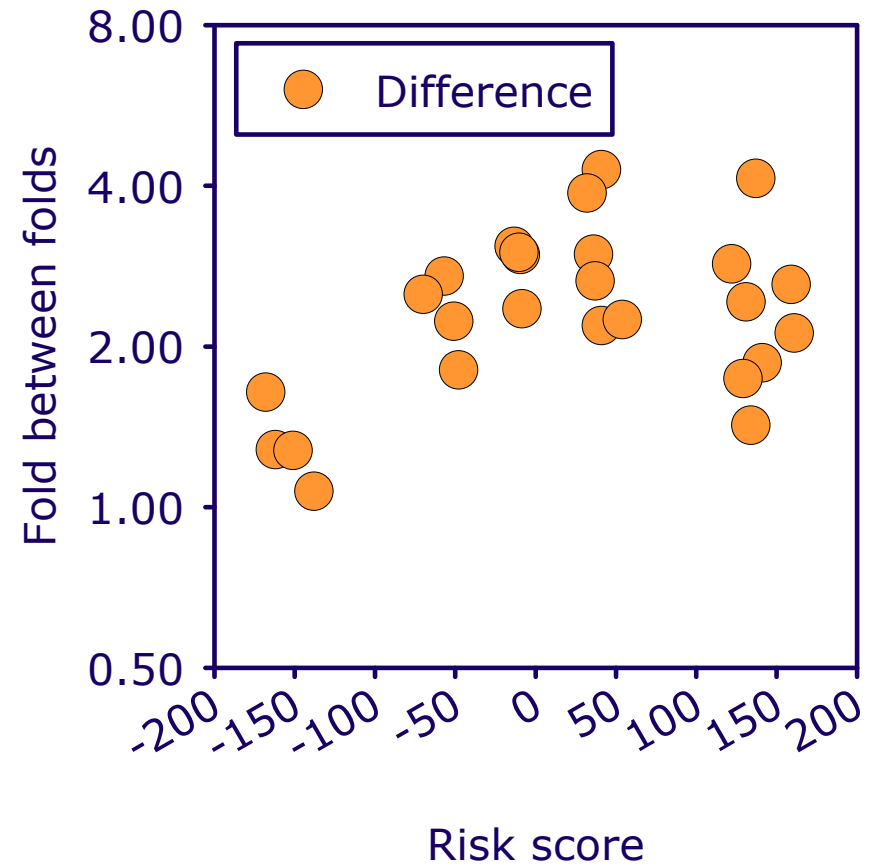
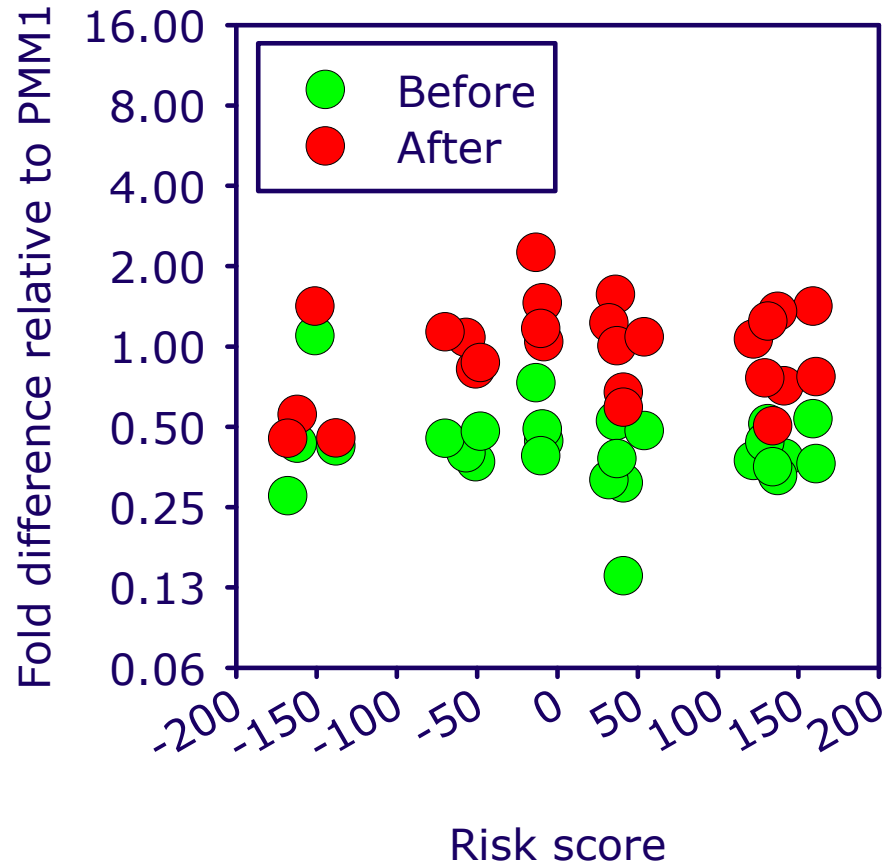
Before and after 3 x 3.5 Gy / 2 days



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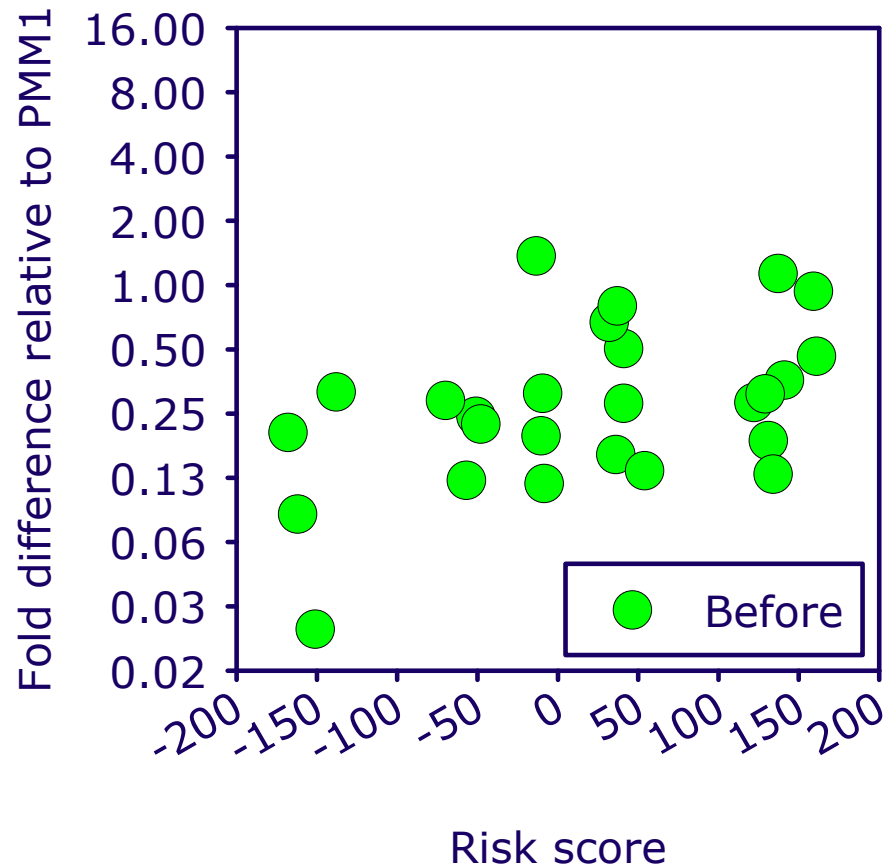
# FAP, Fibroblast activation protein $\alpha$

Before and after 3 x 3.5 Gy / 2 days



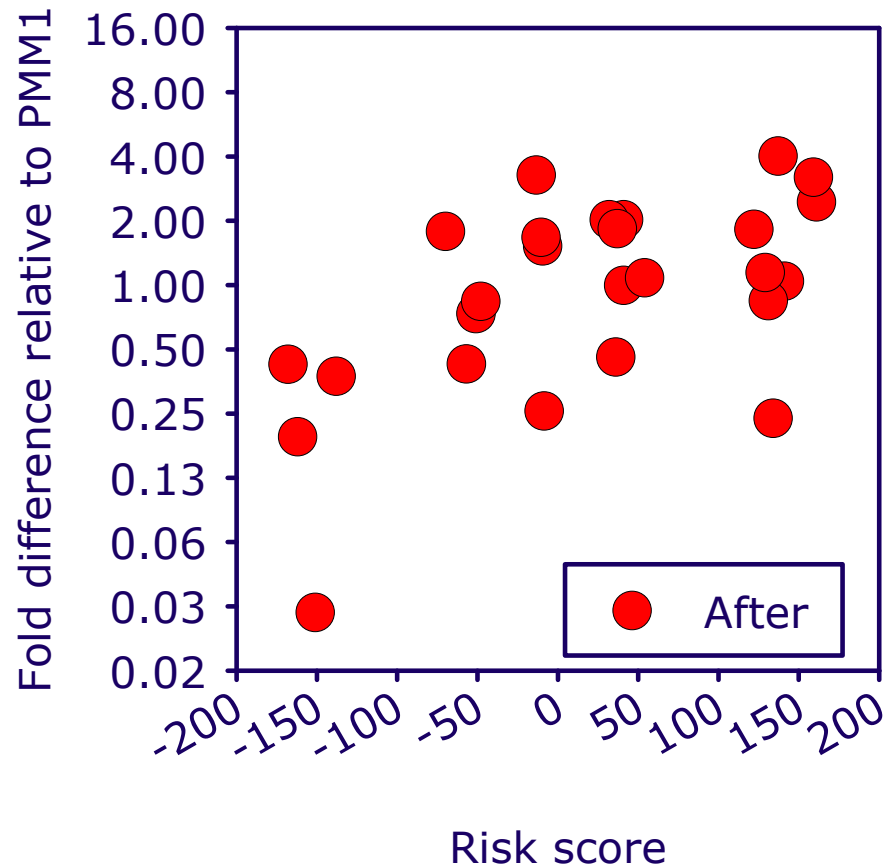


# MXRA5, Matrix-remodelling associated 5 (Adlican) Before and after 3 x 3.5 Gy / 2 days



- Adhesion protein with leucine-rich repeats and immunoglobulin domains related to perlecan (large extracellular matrix proteoglycan)
- Upregulated during senescence, in skin fibroblasts from centenarians, and in cancer

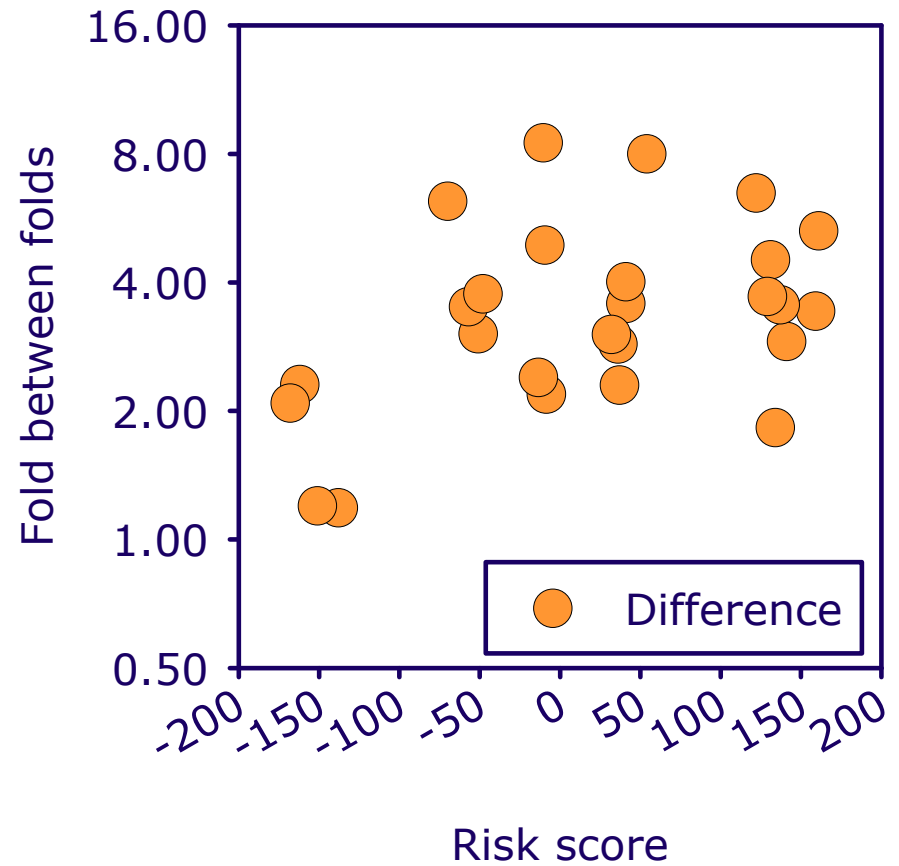
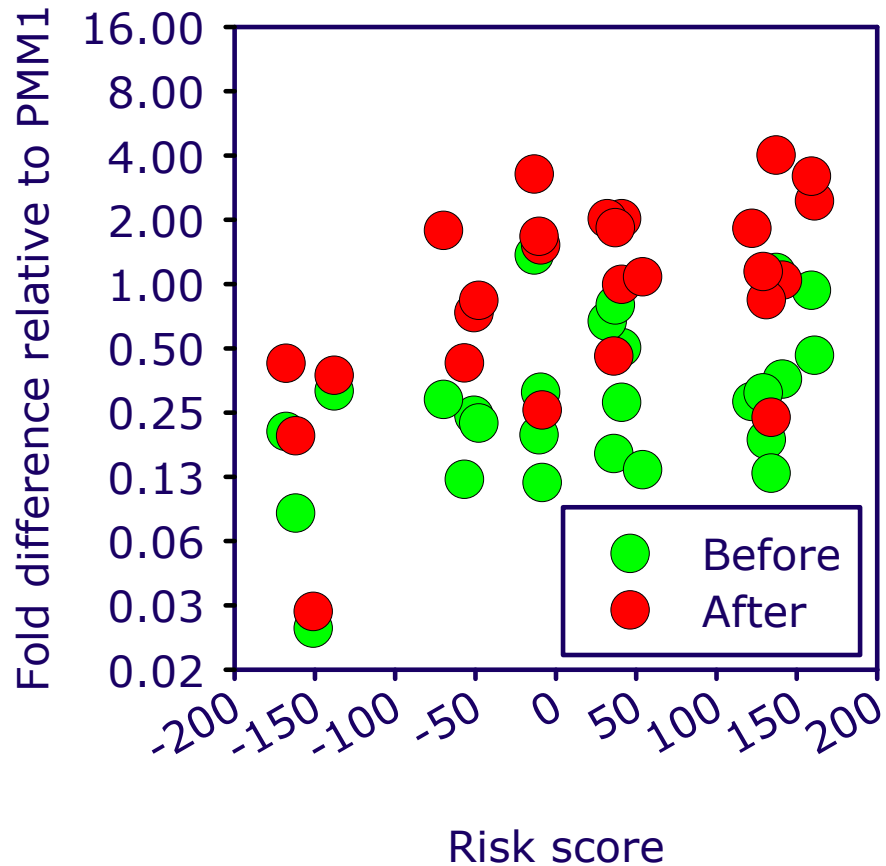
# MXRA5, Matrix-remodelling associated 5 (Adlican) Before and after 3 x 3.5 Gy / 2 days



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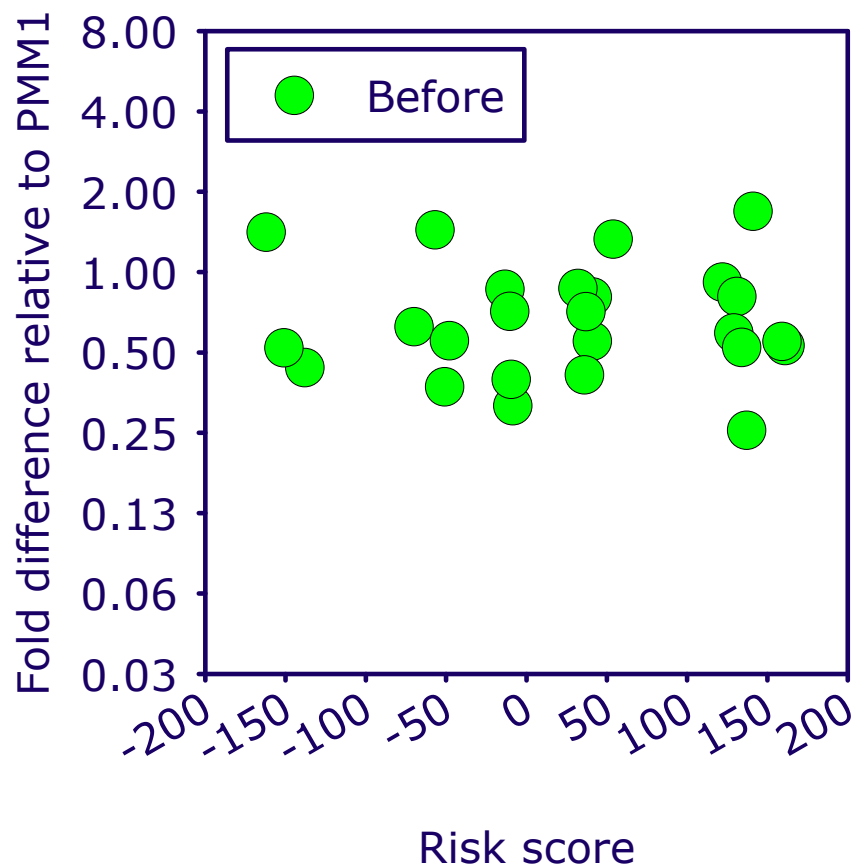
# MXRA5, Matrix-remodelling associated 5 (Adlican)

Before and after 3 x 3.5 Gy / 2 days

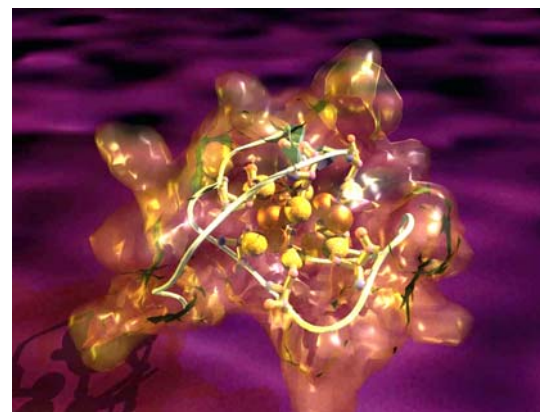


# MT1X, Metallothionein 1X

Before and after 3 x 3.5 Gy / 2 days

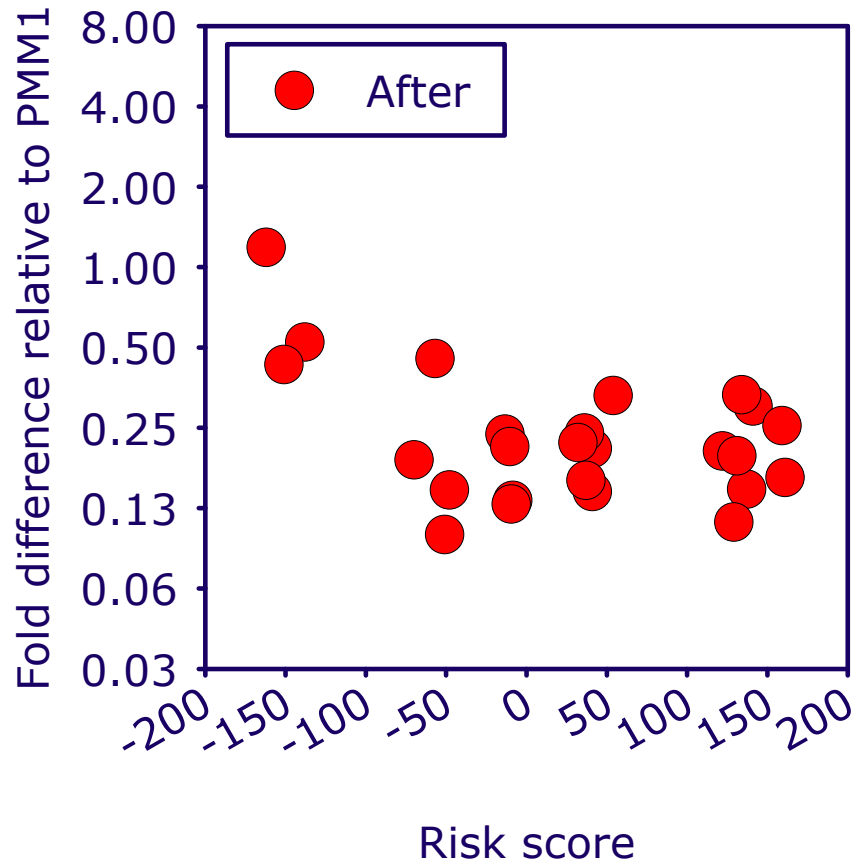


- Family of small proteins, 61-62 amino acids with 20 cysteines
- Involved in
  - zinc homeostasis
  - protection against heavy metal toxicity and oxidative damage

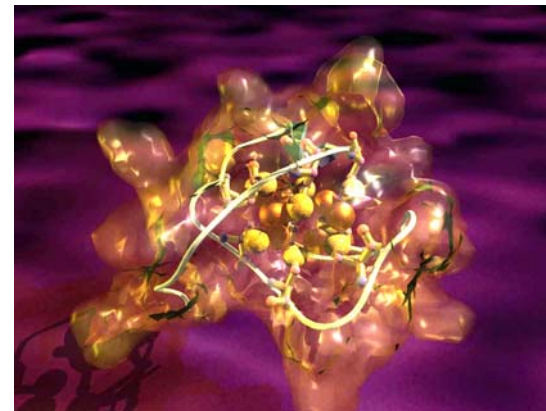


# MT1X, Metallothionein 1X

Before and after 3 x 3.5 Gy / 2 days

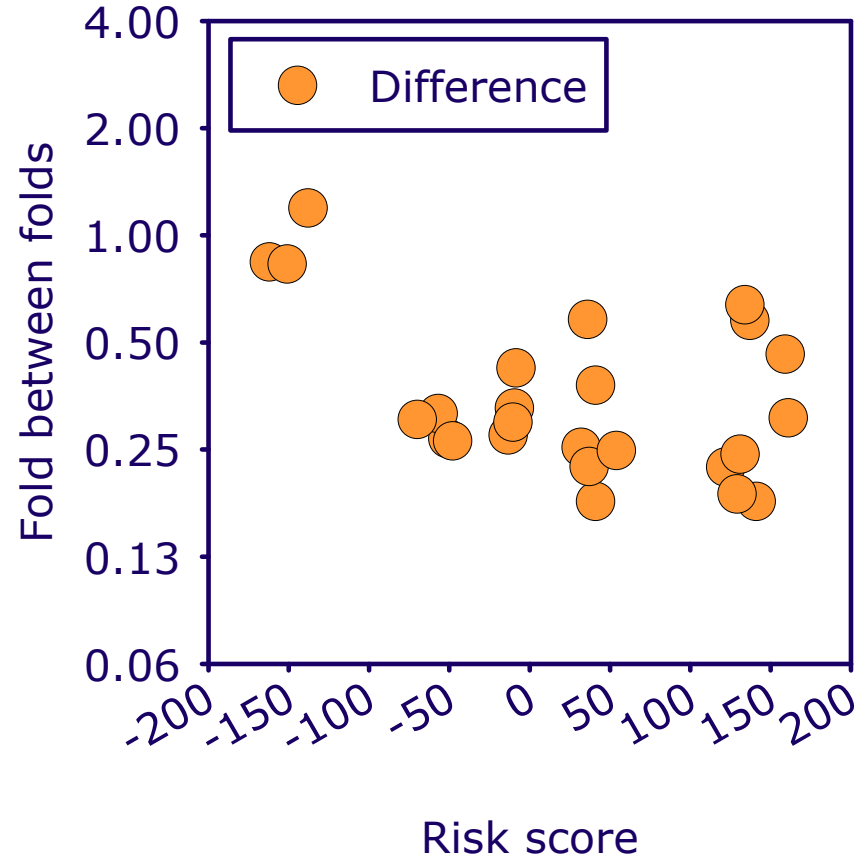
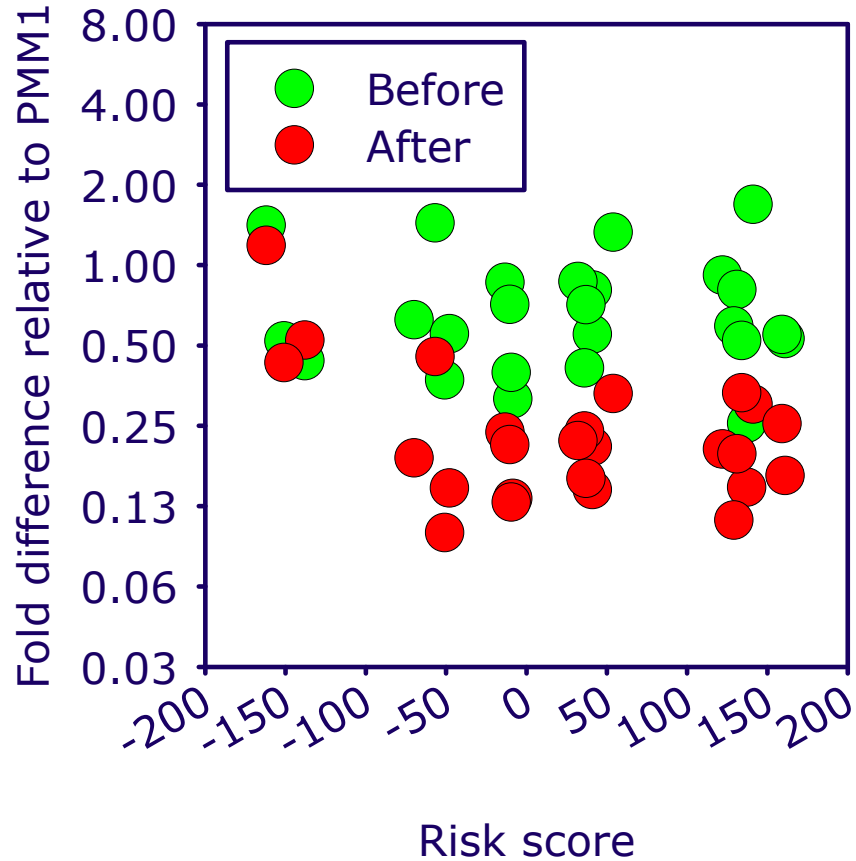


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# MT1X, Metallothionein 1X

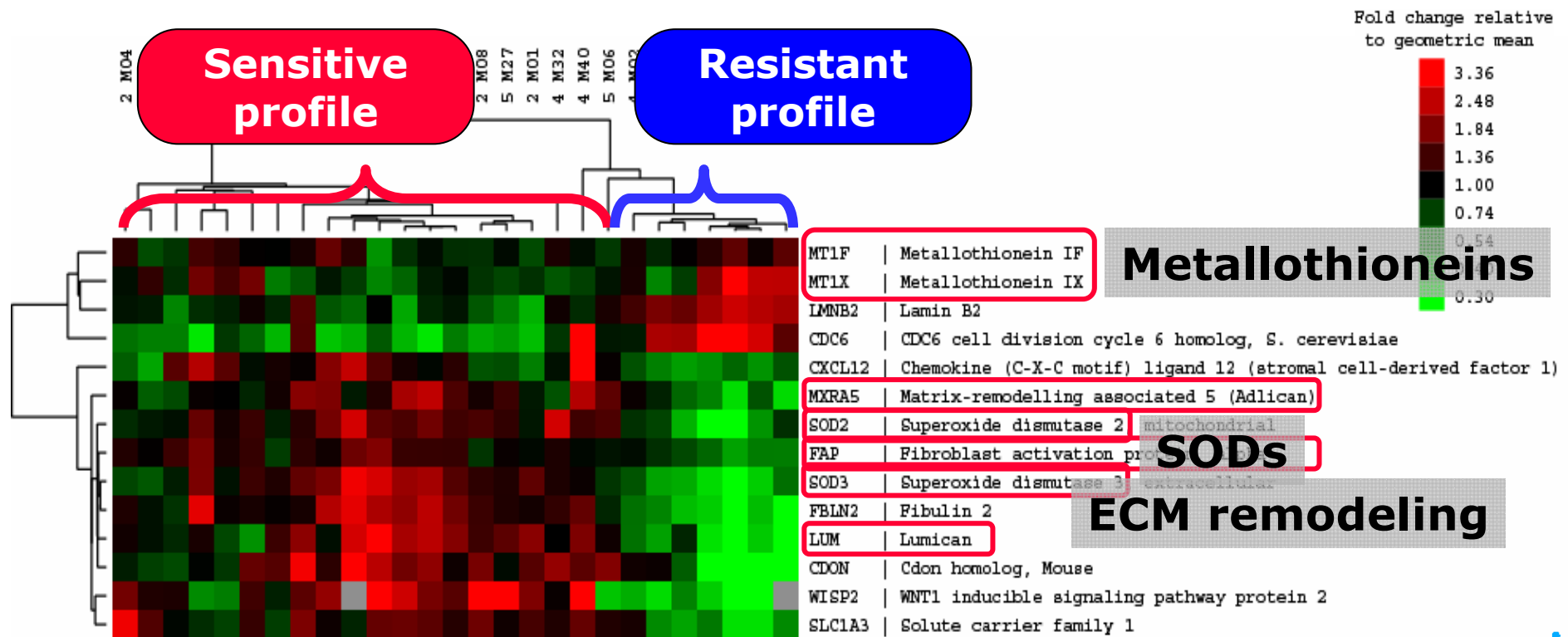
Before and after 3 x 3.5 Gy / 2 days



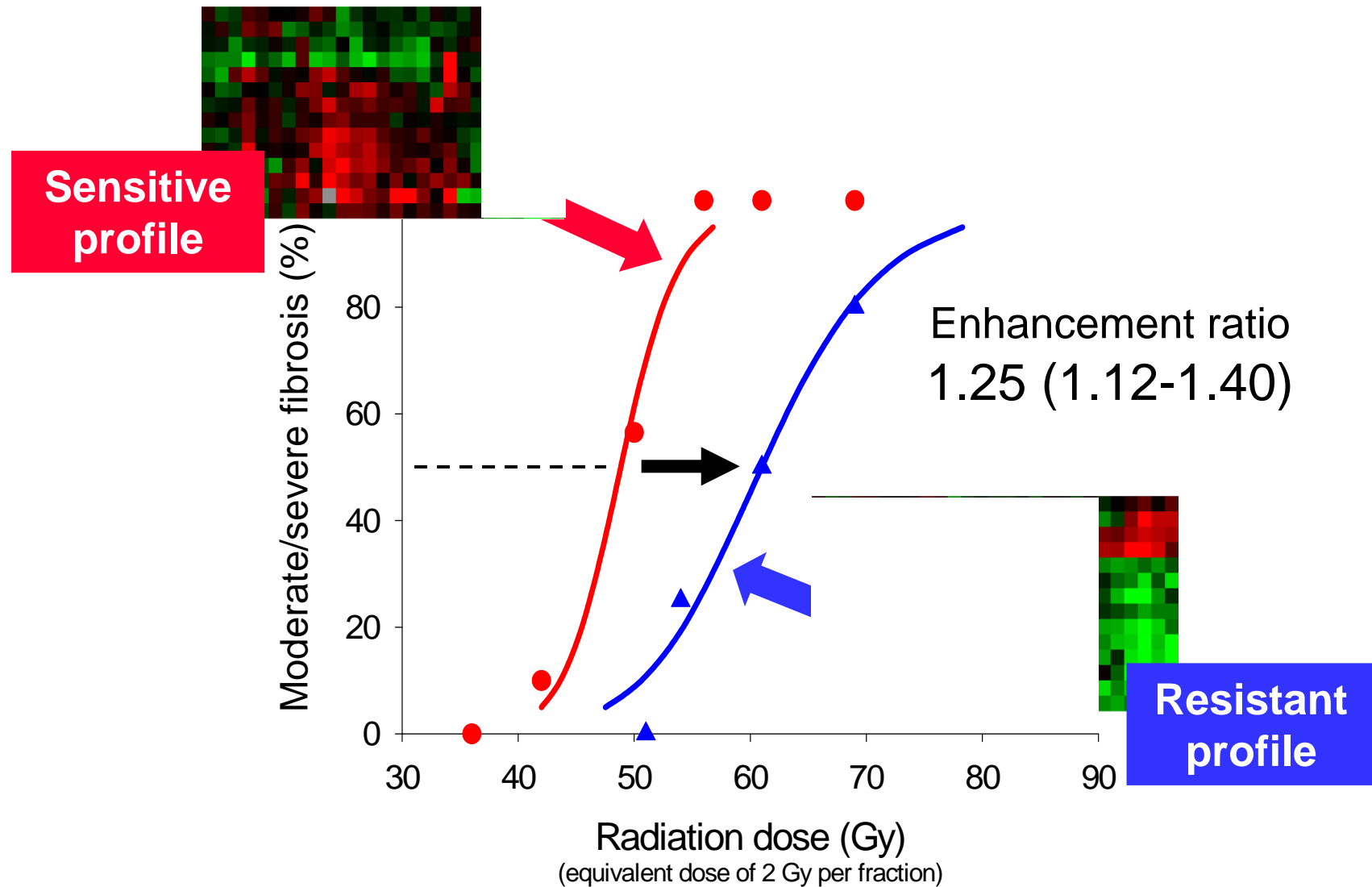


# 'Independent' validation - real-time PCR

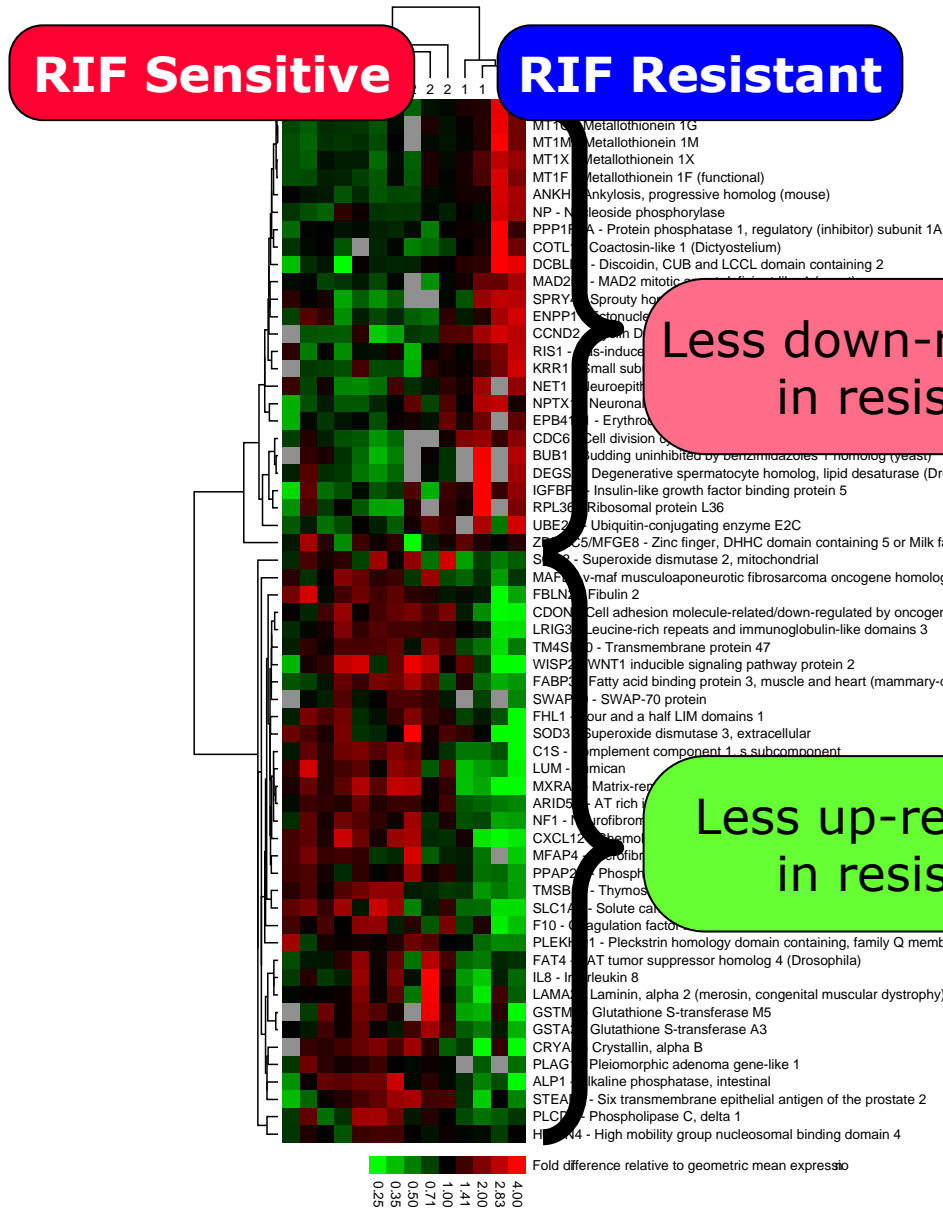
- Same and more cell lines (but different batches)
- New irradiation - reference gene: *PMM1*
- Data based on **delta values** (before and after IR)



# Genetic profile and risk of subcutaneous fibrosis



# Genome-wide approach



Differentially expressed genes after 3 x 3.5 Gy / 2 days (total: 60)

Less down-regulated in resistant

Less up-regulated in resistant

↓  
Pathway analysis (Ingenuity)





# Future studies

- Functional studies on fibroblasts
  - Validate differential mRNA expression after irradiation
  - Differential miRNA expression after irradiation ?
  - Pathway analysis (siRNA)
  - SNP arrays ?
- Animal studies
  - Subcutaneous fibrosis (leg extension)
  - Lung fibrosis



# Acknowledgements

- Department of Experimental Clinical Oncology
  - Jens Overgaard
  - Nicolaj Andreassen
- Radiumhospital, Oslo, Norway
  - Anne-Lise Børresen-Dale
  - Olaug Rødningen
  - Trevor Hastie (Stanford University, USA)
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