## Mining through Gene Expression Profiles for Novel Biomarkers for Tuberculosis

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## Outline

- Background of Tuberculosis
- Novel Host Gene expression biomarker for TB diagnosis
  - Discovery
  - New Diagnostic tool
  - New method for Treatment Monitoring
  - For stratification of Latent Tuberculosis

## Problems





- WHO Global Tuberculosis Report 2016: Total Tuberculosis case 10.4 M, Dead 1.8 M, only 61% of those cases were diagnosed
- Thailand is one of the 30 TB high burden country; incidence 119,000 new TB cases, only 60% were bacteriologically confirmed
- Current TB diagnostic varied in sensitivity and usually takes long turn around time (2 weeks – 2months) and rely much on the quality of the sputum samples
- Low bacterial load in HIV infected individual and children infected with TB and often seen disseminated TB rather than pulmonary TB

## **Background : TB Infection**



Active TB disease (ATB): • is characterized by systemic features i.e. fever, weight-loss with localized symptoms of tissue destruction

Latent TB Infection (LTBI):
Infections with presented immune reactions but no symptom

Pascual V. et al. Annu. Rev. Immunol. 2010.

## Ways to Tackle TB Problems

Figure 2. Projected acceleration in the decline of global tuberculosis incidence rates to target levels



<sup>t</sup> New Tools

- Vaccine
- Treatment

#### **Diagnostics**

- Early Detection
- Rapid and more accurate
- POCT for active TB and latent TB
- Better biological indicators for safety and efficacy
- Biological indicators for treatment response

The End TB strategy, WHO 2015

## **Diagnosis of TB**



#### **Clinical Diagnosis**



Molecular Diagnostics



Acid fast bacilli staining of Sputum smear



Interferon Gamma release assay (IGRA)



TB Culture



#### **Rapid Test**

**Blood gene** expression analysis delivers a snapshot of global host responses against infection



### Transcriptome Analysis Identified "Blood Transcriptional Signatures" Exclusive for TB



- Identified genes that differentially expressed only in Active TB but not LTBI or healthy
- Global gene expression pattern from most of LTBI cases resembles that of healthy
- "Active TB Pattern" changed back to "Healthy Pattern" after treatment completion
- Most of the highly differentiated genes were belonged to IFN-responsive genes family

Modular and pathway analysis revealed that the TB signature was dominated by a neutrophil-driven interferon (IFN)inducible gene profile

- Pathway analysis revealed that most of the highly differentiated genes among active TB and healthy control are from IFN gamma and Type I Interferon pathways
- Modular analysis from various types of cells isolated from the same whole blood samples shows that induced IFN genes are overexpressed in Neutrophils and Monocytes but not CD4- and CD 8 - T cells



Changes in Genes Expressions were Detected as Early as 2 Weeks after anti-TB Treatment Initiation

South Africa 2011 Cohort, genes normalised to median (15837)



- Gene expression profiles in blood of African untreated TB patients were compared with profiles after 2 wks, 2 months 6 months and 12 months after initiation of anti-TB treatment
- Changes were seen as early as 2 wks and gradually reduced to normal
- Pathway analysis reveals genes with highest differentiation are from IFN signaling pathway



Bloom, C. I et al. 2012 PLoS ONE, 7(10).

#### Blood gene expression signatures can differentiate Active TB in an HIV-TB co-infection cohort



- 27 minimum transcripts were identified to differentiate active TB patients from latent TB individuals
- Develop a disease risk score that takes expression level of the 27 genes to calculate the risk of having active TB
- Disease risk score can be used for diagnosis of active TB with 95% sensitivity and 90% specificity
- Differentiation power does not decrease from HIV status

Kaforou, M., et al. PLoS Med 2013, 10(10)

## **New Diagnostic Method for TB**

For use with smear negative TB, **HIV-TB and Childhood TB** Use samples other than sputum Novel Biomarkers Faster turnaround time **High sensitivity and specificity Gene Expression biomarkers in Blood** 

## Methods

### 1. Blood Collection

2. RNA Extraction and Reverse Transcription 3. Measure level of target RNA (Expression)







## Methods

 Selected genes with highest differentiate power from public TB microarray data

- Tested the "Top 20" genes in small sample size (10 TB and 10 Healthy)
- Defined a combination of genes that best predict active TB → "TB Sick Score"
- Tested in with bigger sample size (38 TB, 40 Healthy, 18 Treated TB)

Comparison of 11 Selected Gene Expression Levels among Active TB Healthy and Previous TB



Satproedprai N. et al. 2015 genes and immunity

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## List of Genes in the Panel

FCGR1A	FCGR1B1	
FCGR1B2	APOL1	
STAT1	KAZN Sele sugge	ction sted by
HPRT1**	MAFB Genon association	ne-wide ciation udy

#### **\*\*** Internal control gene

## Results: "TB Sick Score" is highly specific for Active TB patients



Satproedprai N. et al. 2015 genes and immunity

### Sensitivity and Specificity of "TB Sick Score" as Compared to Culture Confirmation

Diagnosis Results	ТВ	Healthy Control	Cured TB	Total
ТВ				
(TB sick score ≥	33	0	0	33
1.0)				
Not TB				
(TB sick score <	7	38	18	63
1.0)				
Total	40	38	18	96
Sensitivity82.5%Specificity100%Positive Predictive Value (INegative Predictive Value(TB incidence in Thailand =	₽₽V) <mark>10(</mark> (NPV) 88 = 182/100,000)	Satpi )% .89%	roedprai N. et al.	2015 genes and immunity 18



#### **Comparison of Gene Expression Level** in Smear Negative TB Cases

7 out of 9 selected genes showed p value > 0.01 when compare gene expression levels between smear negative culture positive, smear negative culture negative and change diagnosis

Normalized Expression

![](_page_19_Figure_2.jpeg)

## Sensitivity and Specificity of the New Method in Sputum Smear Negative Patients

![](_page_20_Figure_1.jpeg)

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data

# Gene expression biomarkers and TB treatment monitoring

### **Standard TB Treatment Course = 6 months**

![](_page_22_Figure_1.jpeg)

# Gene expression levels changes during the course of TB treatment

![](_page_23_Figure_1.jpeg)

18 smear positive TB patients with culture confirmation
Follow up for 4 visits during TB treatment

Visit 1: at Diagnosis Visit 2: 2 wk. after treatment Visit 3: 2 mo. after treatment Visit 4: Treatment complete

Unpublished data

# Gene Expression Biomarkers as a Tool for Stratification of Latent TB

## Latent TB – The Key to End TB?

![](_page_25_Figure_1.jpeg)

### Can Gene Expression Biomarkers differentiate immune spectrum of LTBI?

![](_page_26_Figure_1.jpeg)

Nature Reviews | Disease Primers

#### Pai, M. et al. 2016 Nat. Rev. Dis. Primer

# Can Gene Expression Biomarkers differentiate immune spectrum of LTBI?

![](_page_27_Figure_1.jpeg)

IGRA -veIGRA +veIGRA +veIGRA +veChest X-rayChest X-rayChest X-ray ±Chest X-rayNormalNormalSputum -veAbnormalAbnormalSputum -veCulture -veSputum -veSputum -veCulture -veCulture +veCulture +ve

# Expression levels of *FCGR1* changes according to the Immune Spectrum of TB infection

![](_page_28_Figure_1.jpeg)

#### Unpublished data

### **Gene Expression Biomarkers in LTBI**

![](_page_29_Figure_1.jpeg)

	ROC AUC (95% CI)	Sensitivity (95% CI)	Threshold
By 6 month period			
1-180	0.79 (0.76-0.82)	71.2% (66.6-75.2)	61%
181-360	0.771 (0.75-0.79)	62.9% (59.0-66.4)	61%
361-540	0.726 (0.70-0.76)	47.7% (42.9-52.5)	61%
541-720	0.540 (0.49-0.59)	29.1% (23.1-35.9)	61%
>720	0.496 (0.43-0.56)	5.4% (2.4–13.0)	61%
By 12 month period			
1-360	0.779 (0.76-0.80)	66.1% (63.2-68.9)	61%
360-720	0.647 (0.62-0.673)	37.5% (33.9-41.2)	61%
Total time period	0.743 (0.73-0.76)	58.4% (56.1-60.7)	61%

Sensitivity values are reported at a specificity of 80.0% (95% CI 78.6-81.4). ROCAUC=area under receiver operating characteristic curve. ACS=adolescent cohort study.

Table 1: Cross-validation performance of the tuberculosis risk signature in the ACS training set by days before tuberculosis diagnosis 16 genes transcript can predict Latent TB progression up to 6 months (180 days) in advances with 71.2% sensitivity with overall sensitivity of 58.4% for the total time period of 2 years (720 days)

#### **Discovery of New Biomarkers for TB Diagnosis**

![](_page_30_Figure_1.jpeg)

- Berry MP et al. 2010 identify blood gene expression biomarkers (signatures) in blood that can differentiate Active TB patients from Latent TB and normal control
- Bloom CL et al. 2012 report the possibility of using gene expression signatures as a tool to monitor treatment response
- **Kaforou M** *et al.* **2013** Blood gene expression signatures can differentiate Active TB in a HIV-TB coinfection cohort
- Anderson S. *et al.* 2014 Confirmed that blood gene expression signatures can also be used in pediatrics TB
- Satproedprai *et al.* 2015 Reported the use of 7 genes expression level to accurately differentiate Active TB from Normal and Cured TB
- Zak DE *et al.* 2016 Identify 16 genes panel that can predict TB reactivation 6 months in advance
- Suliman et al. 2018 Using of 4-genes panel to predict up to 2 years of TB onset in Latent TB across 4 African countries

# Summary

Developed a new diagnostic method for TB using RNA biomarkers
 Detect in blood / High Sens. Spec. / Short turnaround time

- Can be used to assist Active TB Diagnosis in suspected case with smear negative or culture negative
- Plausible with HIV-TB and Childhood TB

May be used to assist diagnosis of active TB in contact investigation and risk stratification for TB or preventive TB Treatment

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