



### Computational Microstructural Optimization Design Tool for High Temperature Structural Materials

Rajiv S. Mishra (PI), Aniket Dutt (PhD student)
University of North Texas
Indrajit Charit (co-PI), Somayeh Pasebani (PhD student)
University of Idaho

**Project Manager: Dr. Richard Dunst** 

**Grant Number: DE-FE0008648** 

Performance Period: Sep. 2012 to Aug. 2014

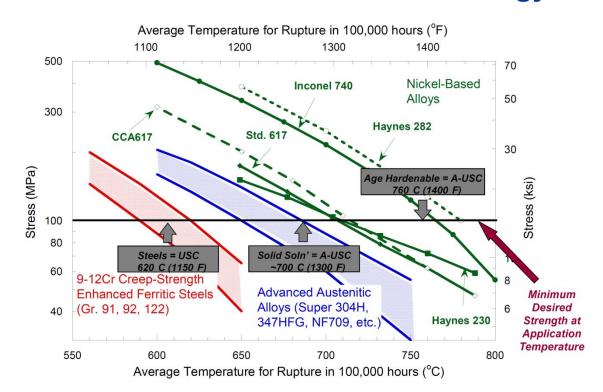


### **Objectives**



- Develop a methodology for microstructural optimization of alloys genetic algorithm approach for alloy microstructural optimization using theoretical models based on fundamental micro-mechanisms, and
- Develop a new computationally designed Ni-Cr alloy for coal-fired power plant applications.

# Robert R. Romanosky, National Energy Technology Laboratory, April 2012 Materials Limit the Current Technology





### **Background – A Bit of History**



#### Timeline of dislocation-particle strengthening

- Dispersion strengthening identified as a potent mechanism for enhancing elevated temperature strength in the early works of Ansell and Weertman in 1950s
  - CONCEPT- Elastically hard particle repels dislocation
- Srolovitz and co-workers in 1980s
  - FUNDAMENTAL SHIFT- dislocation-particle interaction undergoes repulsive→attractive transition at elevated temperatures >0.35 T<sub>m</sub>

#### **Questions**

- Why did it take 40 years from the initial papers on dispersion strengthened materials and empirical development of threshold stress for creep to come up with physics based models?
- Why is the development of high temperature alloys incremental and primarily dependent on experiential approaches?

Is it because the field lacks proper computation tools and theoretical development!



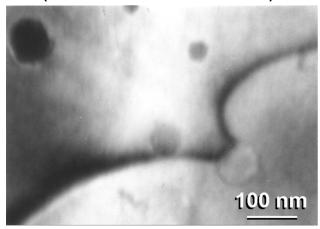
### **Background**



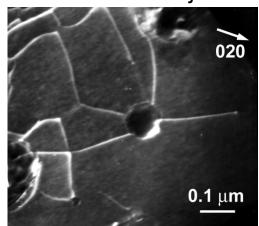
Summary of some of the key development made possible by TEM studies

Reference	Remarks
Nardone and Tien (1993)	First identification of departure side pinning.
Schroder and Arzt (1985)	Weak-beam micrographs showing clear dislocation contrast at the dispersoid.
Herrick et al. (1988)	First quantification of (a) percentage dislocation looped vs. attached, and (b) critical take-off angle as a function of temperature.
Liu and Cowley (1993)	Multiple dislocation-particle interaction; sharp kinks on the detached dislocations that straighten out.

A dispersion strengthened platinum alloy (Heilmaier *et al.* 1999)



Al-5 wt.% Ti alloy (Mishra and Mukherjee 1995)

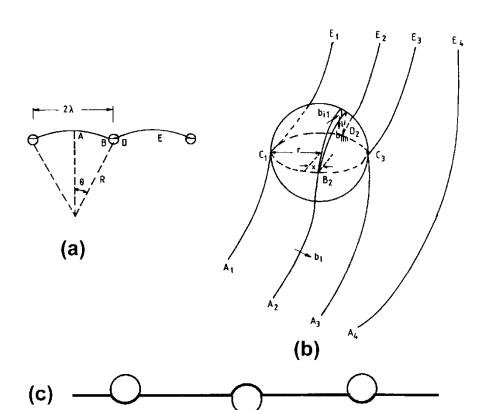




### **Background – Theoretical Models**



Development of dissociation and positive climb concepts



- (a) and (b) A schematic illustration of dissociation of dislocation at matrix-particle interface that can result in an attractive dislocation-particle interaction (Mishra et al. 1994).
- (c) Up and down climb concept of Shewfelt and Brown (1977) and Arzt and Ashby (1982).
- (d) A modified concept of 'positive climb' (Mishra and Mukherjee 1995).

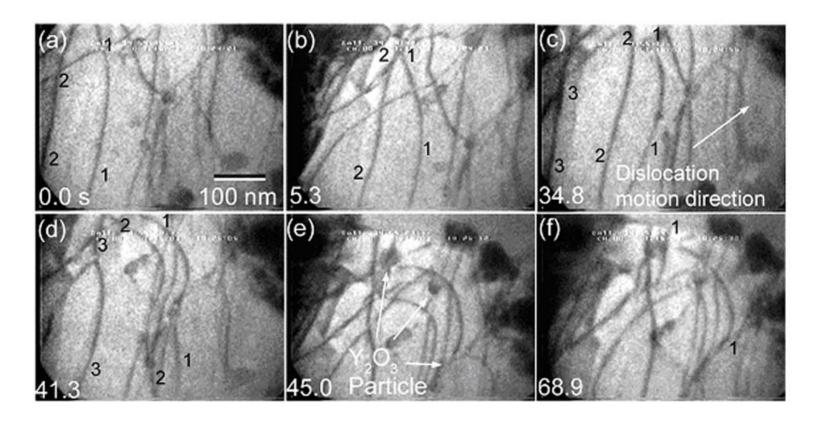
(d)
Atoms have to be removed from this area during dislocation climb



#### **Background – In-situ TEM**



High Temperature In-situ TEM Straining Experiment and Detachment Angle Measurement



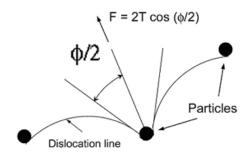
(a-f) Images captured from a video sequence recorded during the in situ straining. Dislocation movement through the array of  $Y_2O_3$  particles at 250 °C (Deshmukh, Mishra and Robertson, 2010)

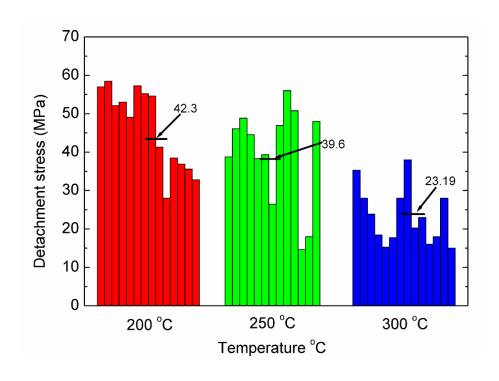


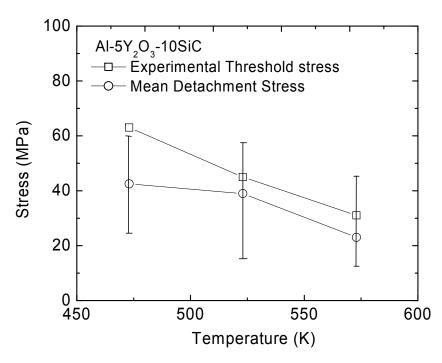
### **Background – In-situ TEM**



#### **Detachment Angle Measurement and Threshold Stress**









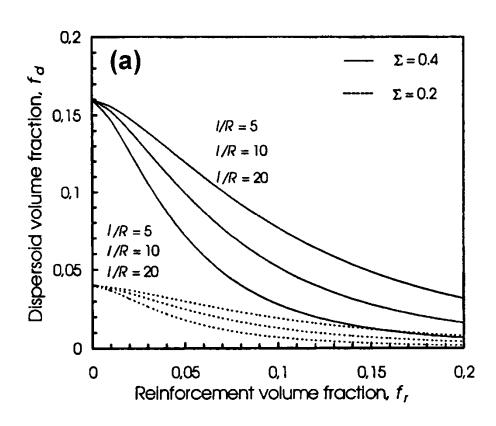
#### **Motivation and Path Forward**

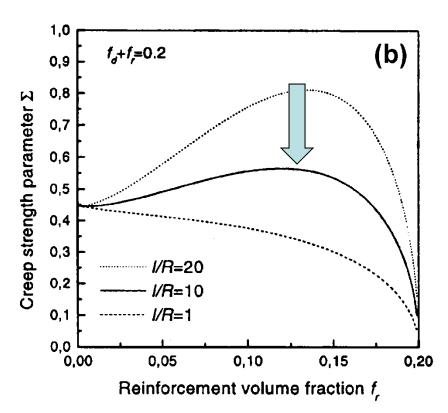


Synergy among strengthening mechanisms: Can 2+2 be greater than 4?

- Rosler and Baker (2000) have proposed a theoretical concept for the design of high temperature materials by dual-scale particle strengthening
- The creep strength parameter, ∑, is defined as

$$\sum = \sqrt{f_z} \left( 1 + 2(2 + i \cdot R) f_z^{3-2} \right)$$







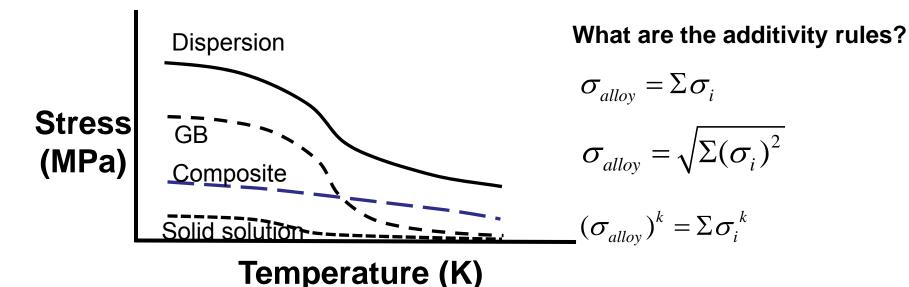
## Discussion of Strengthening Mechanisms



There are four major components to strengthening in the nanostructured nickel based alloys produced by mechanical alloying:

- grain boundary strengthening,
- solid solution strengthening
- dispersion strengthening, and
- composite strengthening.

#### **Effect of temperature**





#### **Proposed Microstructure**



Develop dual-scale strengthened Ni-Cr-Al<sub>2</sub>O<sub>3</sub> alloys The chosen alloy system has:

- Cr for solid solution strengthening
- nano Cr<sub>2</sub>O<sub>3</sub> and/or CrN particles of 2-3 nm diameter for dispersion (currently using nano-Y<sub>2</sub>O<sub>3</sub>) strengthening
- submicron Al<sub>2</sub>O<sub>3</sub> of 0.5-1 micron diameter for composite strengthening through increase in modulus

#### What is the level of synergy?

 Does the load transfer effectively enhance the creep life for equiaxed reinforcement?



#### **Overview of Proposed Work**



#### **OBJ1**: Microstructural Optimization

1A. Definition of design goals (UNT-UI-NETL) and material parameter constraints (UNT) Strength, ductility, creep, residual stresses

1B. Identification of theoretical and phenomenological models (UNT)

1C. Development of Genetic Algorithm optimization scheme (UNT)

Fitness function, Pareto-optimal solution sets, computational parameters

Theoretical equations, data sets, empirical relationships



1D. Computer Simulation of Dislocation Motion for Visualization (UNT)

Multiple obstacles, particle size, particle shape, particle distribution

#### OBJ2: Develop Ni-Cr-Al<sub>2</sub>O<sub>3</sub> with Dual-Scale Microstructure

2A. Processing of GA optimized material (UI) Milling, degassing and compaction forging

2B. Experimental validation: Microstructure and Mechanical Properties (UNT and UI) SEM, TEM, X-ray, hardness, tensile, creep

OUTCOME: Integrated Approach for 'Materials by Design'





# **Computational part**



### **Strengthening Mechanisms**



Low T strengthening

High T strengthening

Grain boundary Strengthening

Dislocation-particle interaction

Dispersion strengthening

Solid solution strengthening

Composite Strengthening

Ni-Cr ODS alloy

Load transfer (reinforcement



# Low temperature strength



Strengthening mechanism	Equation	
Grain size strengthening	$\sigma_{y} = \sigma_{0} + Kd^{-0.5}$	
Solid solution strengthening	$\Delta\sigma_{\scriptscriptstyle S} = \left(\sum k_i^{1\over n} c_i ight)^n$	
Dispersion strengthening	$\Delta\sigma_p = rac{Gb\sqrt{f_d}}{d_p}$	
Composite strengthening	$\sigma_c = V_p \sigma_p + V_m \sigma_m$	
Load transfer coefficient	$\wedge \approx 1 + 2\left(2 + \frac{l}{R}\right)f_r^{\frac{3}{2}}$	







#### **Dislocation creep**

Modified power law creep [1]

$$\dot{\varepsilon} = 8.3 * 10^8 \frac{DGb}{k_B T} \left[ exp \left( -104 \sqrt{\frac{b}{\lambda}} \right) \right] \left( \frac{\sigma' - \sigma_0}{E} \right)^5$$

$$\sigma' = \sigma/\Lambda$$

#### Threshold stress

Dissociation and positive climb model [2]

$$\sigma_0 = 0.002 G\left(\frac{b}{r}\right) exp\left(20\frac{r}{\lambda}\right)$$

- R. S. Mishra and A. K. Mukherjee, Light weight alloys for aerospace application III, TMS, (1995), 319
- 2. R.S. Mishra et al., Philosophical Magazine A,1994, 69 (6), 1097-1109



#### **GA** optimization work



#### Cost function

$$J = \frac{\left[\sum_{i=S,D,HTS} w_i \left| \left(\frac{P_i}{(P_i)_{desired}}\right) - 1 \right| \right]}{n}$$

Various considerations were taken in order to minimize the cost function:

- 100 Individuals were considered in each generation.
- Rank scales were used for the fitness scaling. The rank of the fittest individual was 1, the next fittest was 2 and so on.
- Roulette method was used as a selection function to choose parents for the next generation.
- 10 best individuals survived to the next generation.
- Probability of crossover was chosen 0.85 and rest were produce via mutation.
- The optimization was running until 100 generations were completed or the cost function did not vary significant for 25 successive generations.





#### Notation used for variables:

- [w<sub>S</sub> w<sub>D</sub> w<sub>HTS</sub>]= Weight factors for low temperature strength, ductility and high temperature strength properties.
- r (nm) is the radius of dispersoids particles.
- r<sub>f</sub> (nm) is the radius of reinforced particles.
- f<sub>r</sub> (%) is volume fraction of reinforcement.
- f<sub>d</sub> (%) is volume fraction of dispersoids.

#### The optimization was carried out for two conditions:

I: 15 nm  $\leq$  r  $\leq$  20 nm , 300 nm  $\leq$  r<sub>f</sub>  $\leq$  400 nm , f<sub>r</sub>  $\leq$  15 % II: 2 nm  $\leq$  r  $\leq$  4 nm , 500 nm  $\leq$  r<sub>f</sub>  $\leq$  1000 nm , f<sub>r</sub>  $\leq$  15 %

#### Desired properties

- low temperature 900 MPa
- ductility 10 %
- high temperature strength 100 MPa

G=76 GPa,  $\sigma_{o}$ =17.4 GPa, K= 0.236 MNm<sup>-3/2</sup>, b= 0.249 nm, T=1073 K,  $\dot{\varepsilon}=10^{-9}~s^{-1}$ 



### **GA** results

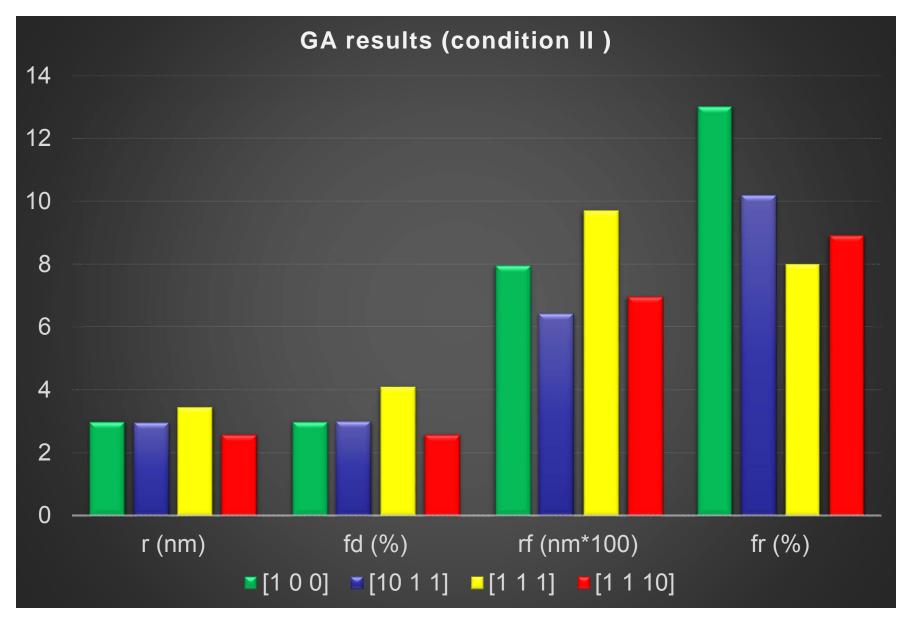


II: 2 nm  $\leq$  r  $\leq$  4 nm , 500 nm  $\leq$  r<sub>f</sub>  $\leq$  1000 nm , f<sub>r</sub>  $\leq$  15 %

Case	[1 0 0]	[10 1 1]	[1 1 1]	[1 1 10]
r (nm)	2.997	2.961	3.44	2.578
f <sub>d</sub> (%)	3	3	4.089	2.578
r <sub>f</sub> (nm)	797	642	971	697
f <sub>r</sub> (%)	13.011	10.199	8	8.917
LTS (MPa)	932.08	899.98	902.54	989.32
Ductility	_	0.0906	0.0996	0.0967
HTS (MPa)	-	132.0247	145.10	150.018

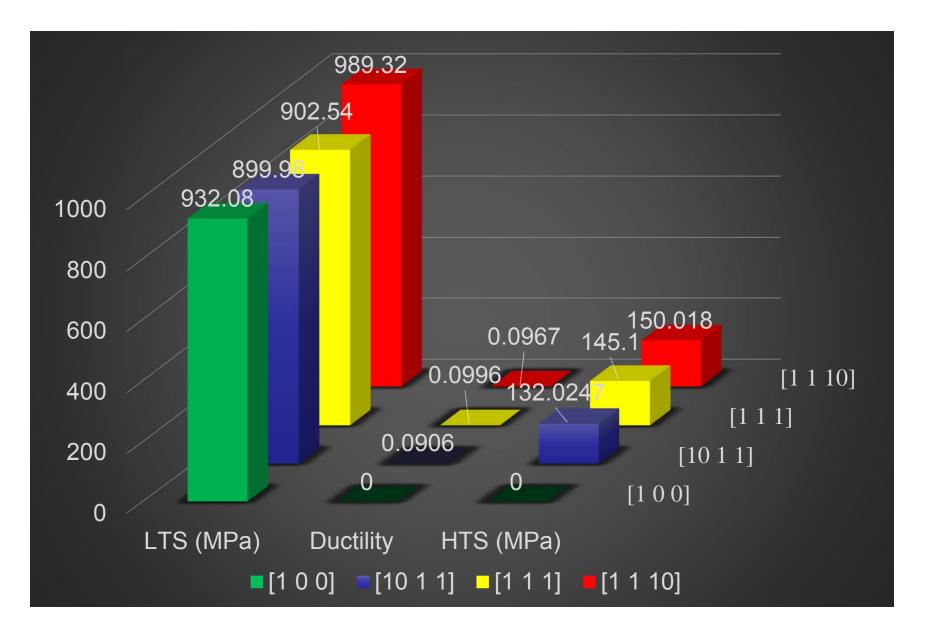
















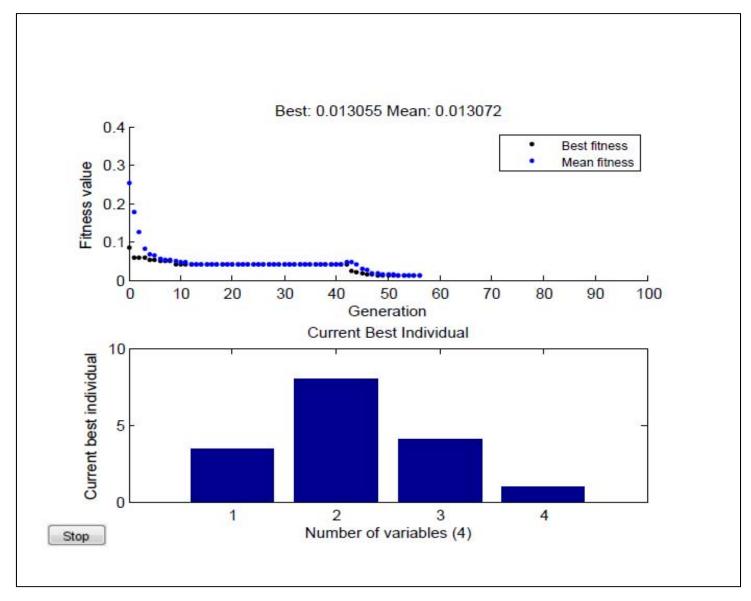


Fig. 2 GA plots for case [10 1 1]



### **Summary for computational part**



- Compilation of relevant theoretical and phenomenological model was done for low temperature strength, ductility and high temperature strength.
- The appropriate models were selected for further GA optimization work.
- The initial results showed:

	Dispersoid radius (nm) ~ 15	
	LTS (MPa) ~ 700	
Condition I	HTS (MPa) ~ 40	
Condition II	Dispersoid radius (nm) ~ 3	
Condition II	LTS (MPa) ~ 900	
	HTS (MPa) ~ 145	



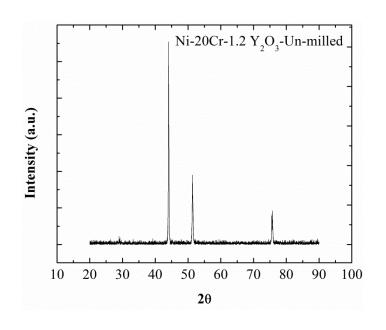


# **Experimental Part**

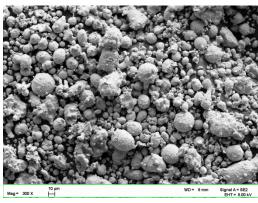


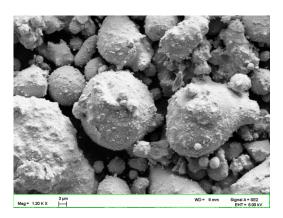
### Ni-20Cr-1.2Y<sub>2</sub>O<sub>3</sub> - characterization

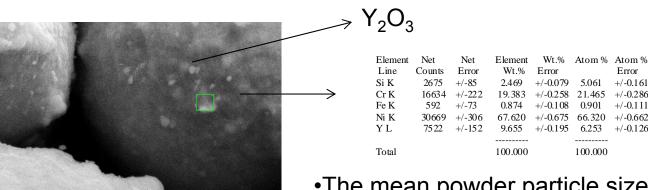




Mag = 8.06 K X







- •The mean powder particle size was 25 mm.
- The Ni powder particles were covered with yttrium oxide nanoparticles as indicated by EDS.



### Milling experiments



- Milling was done for 1 h, 2 h and 4 h and the XRD were used to characterize them.
- XRD patterns showed that 4 h was not long enough to make the yttria peaks disappear.
- Significant peak broadening and peak shift to higher angles were observed after 1 h milling.

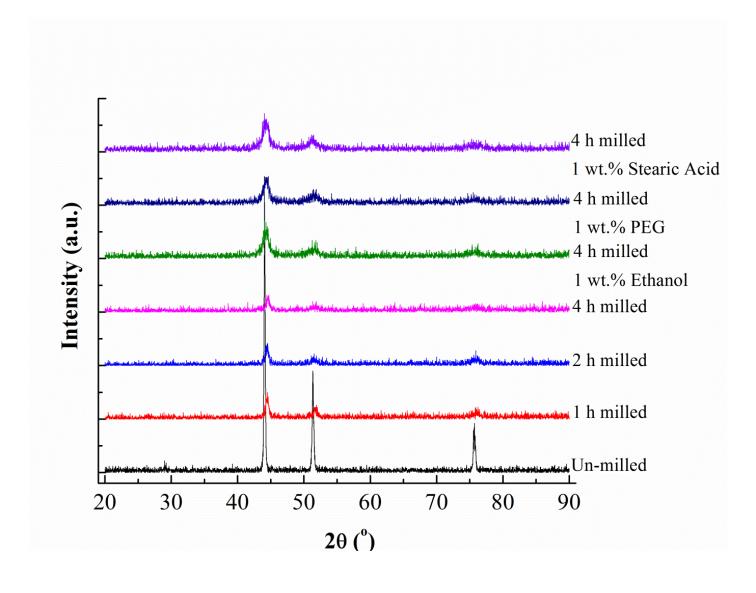








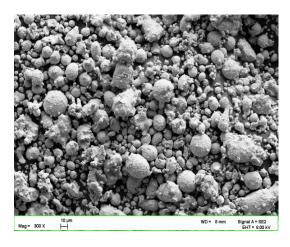


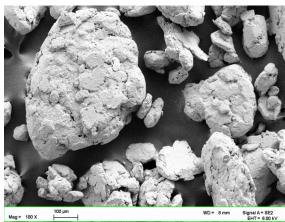


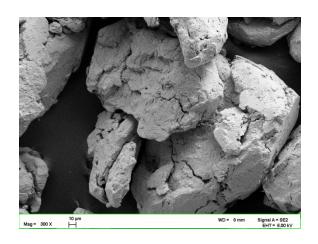


### **Particles agglomeration**









**Un-milled** 

d

-

1 h

2 h

- Only after 1 h the mean particle size increased to 280 mm.
- Significant agglomeration happened in the milled powder
- Agglomeration will decrease the efficiency of mechanical alloying
- The fine particles increase the sintering efficiency and final density.
- Using a particle control agent (PCA) may decrease this agglomeration

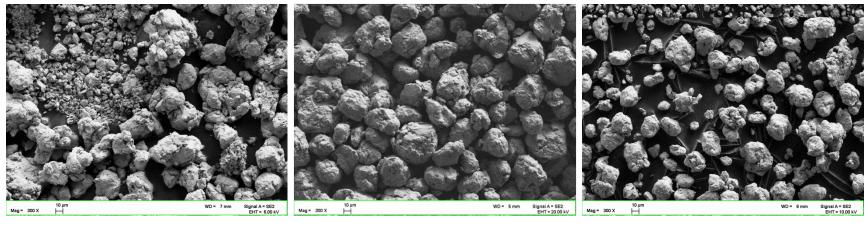
4 h



### **Using PCA**



- In literature, ethanol, poly ethylene glycol (PEG) and stearic acid were used as PCA.
- 1 wt% of ethanol, poly ethylene glycol (PEG) and stearic acid were added to the powder mixture and milled for 4 h.
- The mean particle size of the milled powder deceased using PCA and the agglomeration decreased.
- The efficiency of stearic acid to minimize the agglomeration was more than ethanol and PEG.



4 h- Ethanol 4 h- PEG 4 h- Stearic acid



#### **Summary for Experimental Work**



- Ball milling experiments using a shaker mixer/mill (SPEX) of the Ni-20Cr-1.2Y<sub>2</sub>O<sub>3</sub> (wt.%) alloy composition were carried out.
- Scanning electron microscopy (SEM) in conjunction with energy dispersive spectroscopy (EDS) was performed to characterize the morphology and chemical characteristics of the milled powder.
- It has been determined that steel balls of 5 mm diameter, a ball to powder ratio (BPR) of 10:1 and a milling time of 2 h are as optimal milling conditions.
   A 1wt.% stearic acid was added to the powder mass during ball milling to prevent powder agglomeration.
- The structural parameters under the optimum conditions were found to be as following: average crystallite size (14 nm), lattice strain (0.003%), lattice parameter (0.3536 nm) and mean powder size (33.6 μm).



#### **Future Work**



- Continue the GA effort
- Start dislocation simulation work
- Theoretical modeling/refinement of positive climb model
- Consolidation of ball milled powder
- Mechanical property evaluation

